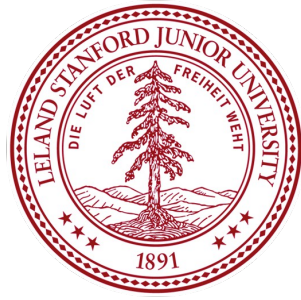


SLAC



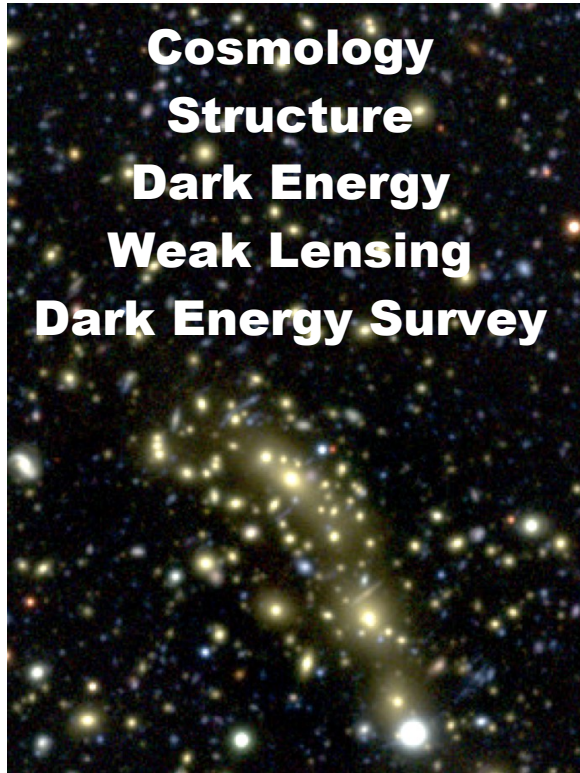
**DARK ENERGY
SURVEY**

Unveiling dark energy and dark matter with weak gravitational lensing

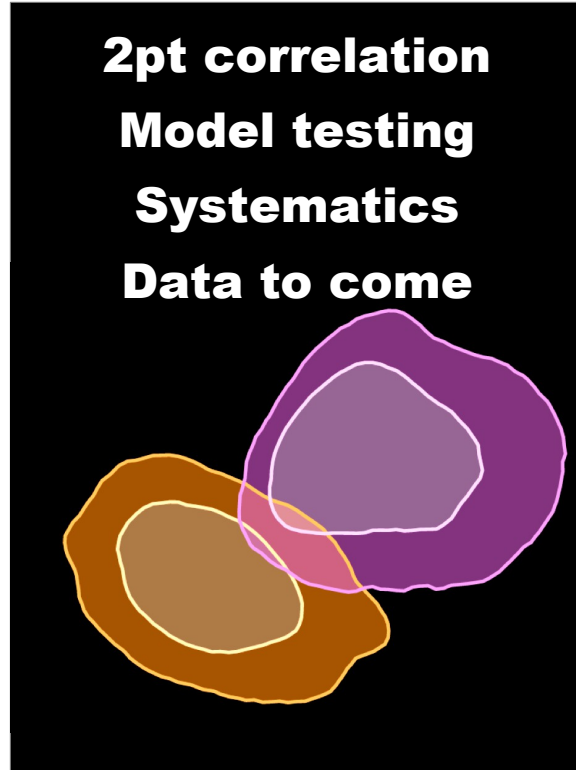
Daniel Gruen, Stanford

SLAC, 2019-02-07

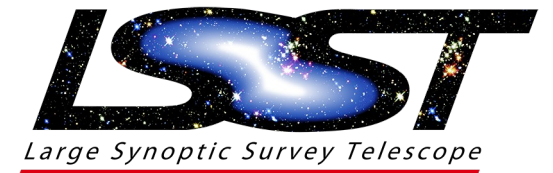
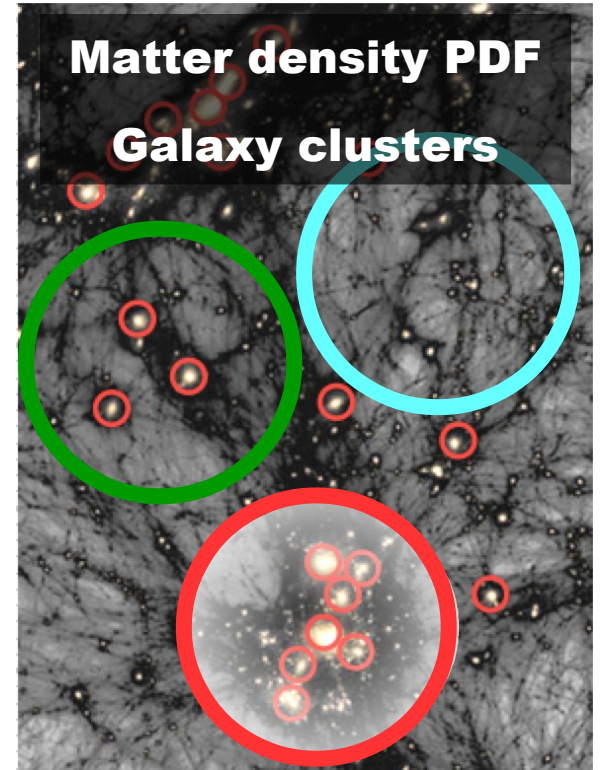
Introduction



Cosmology from Lensing

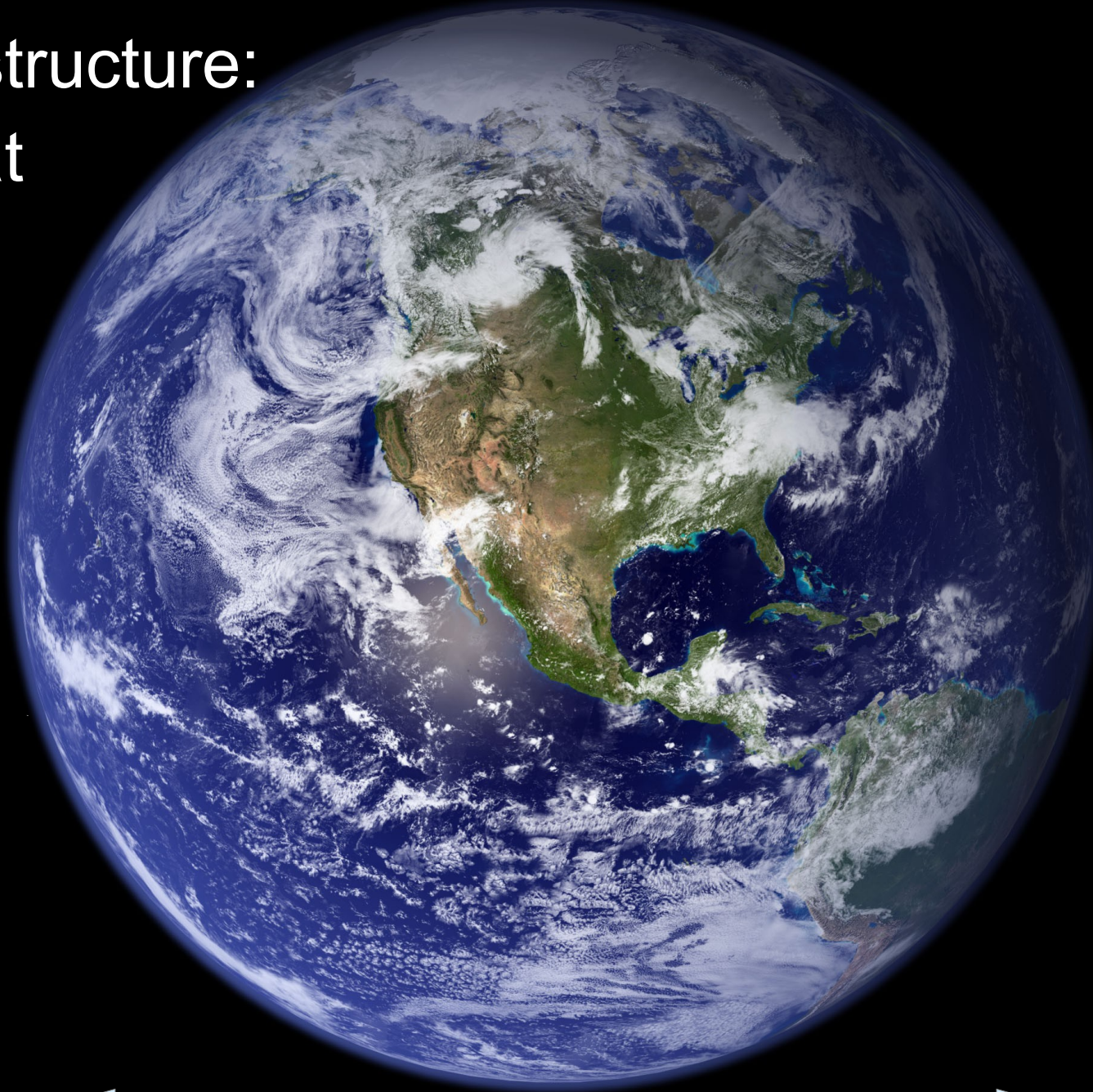


Beyond the power spectrum



Questions welcome!

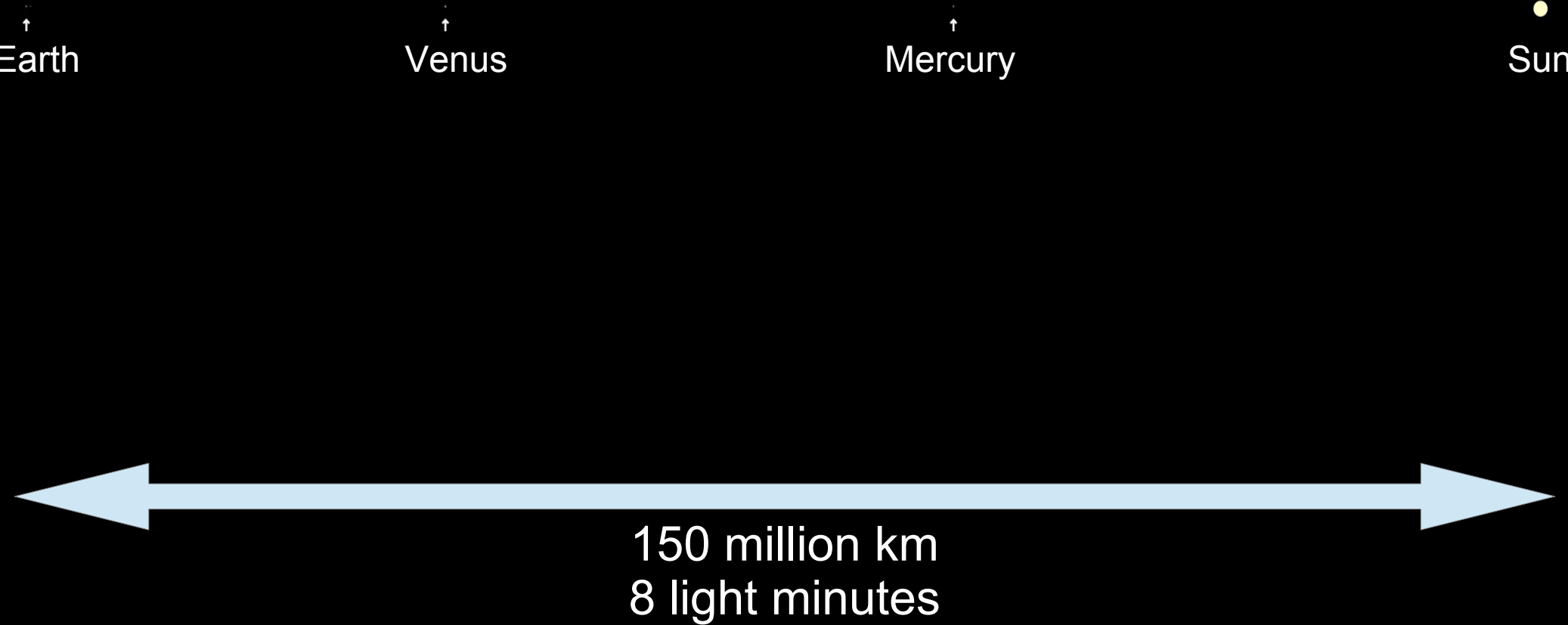
Cosmic structure:
starting at
the Earth



13,000 km
0.04 light seconds

source: NASA/MODIS

X 10,000
inner solar system



↑
Earth

↑
Venus

↑
Mercury

●
Sun

150 million km
8 light minutes

X 10 billion
galaxy



2×10^{18} km
200,000 light years

M31; source: APOD

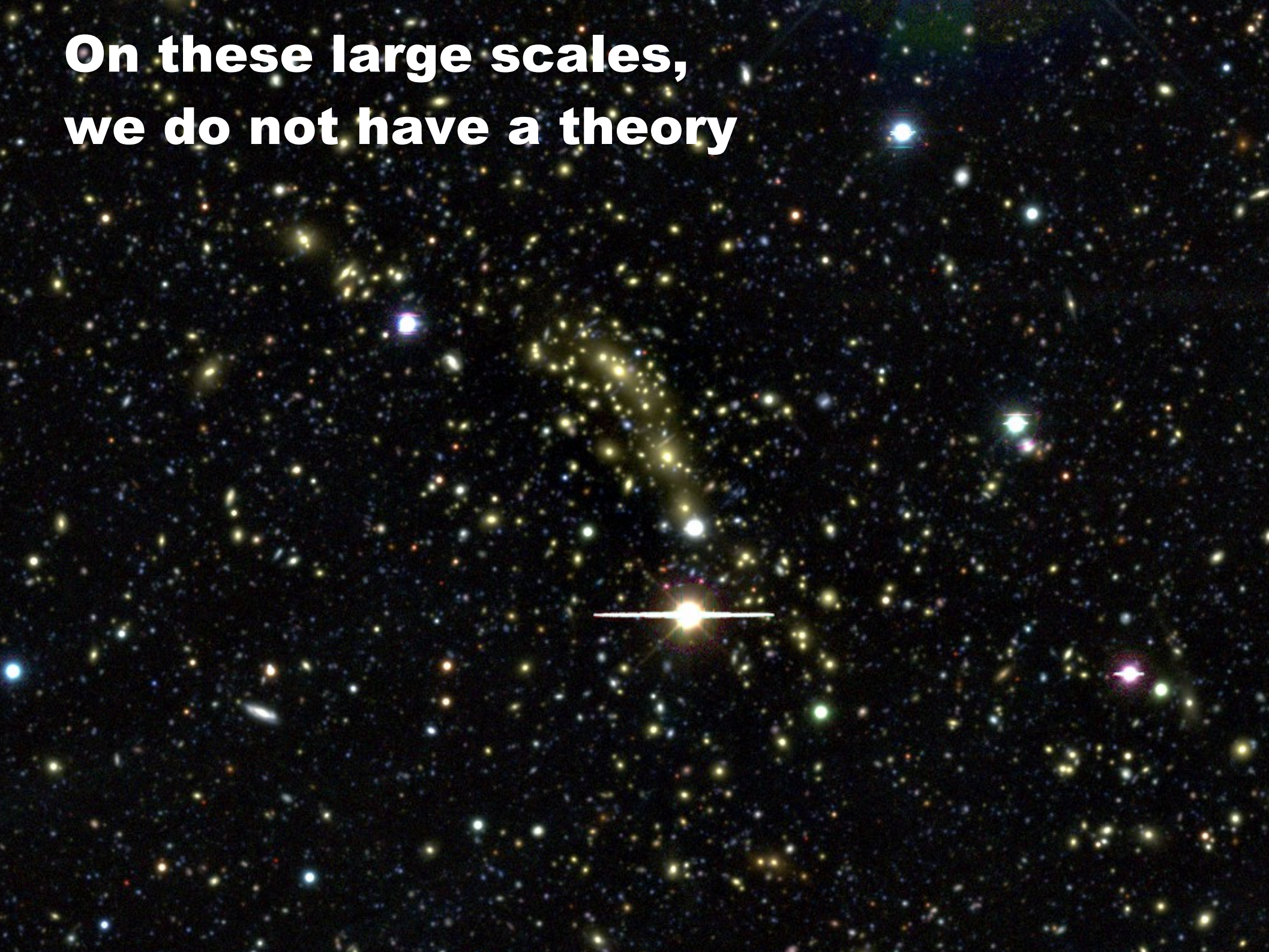
X 15
cluster of galaxies



3×10^{19} km
3 million light years

MACS J0416-2403
source: DES / D. Gruen

**On these large scales,
we do not have a theory**



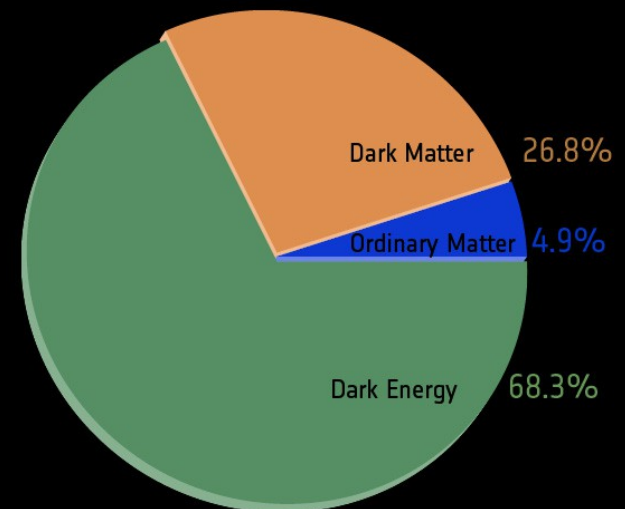
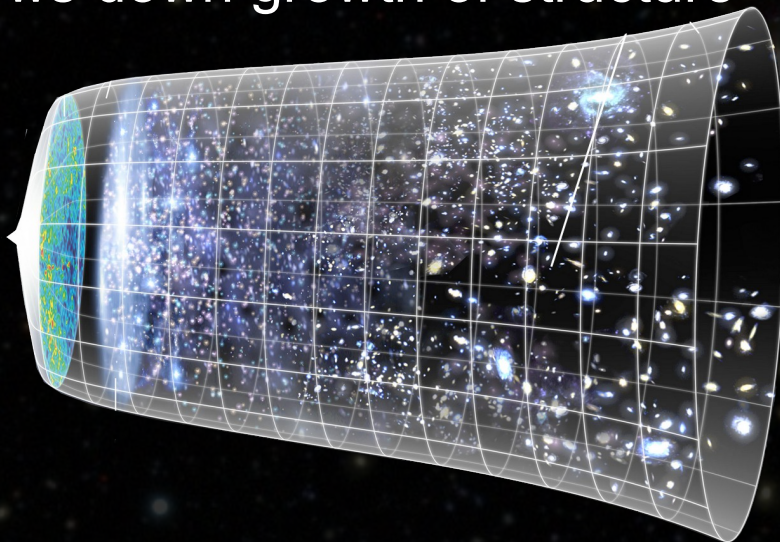
On these large scales, we do not have a theory



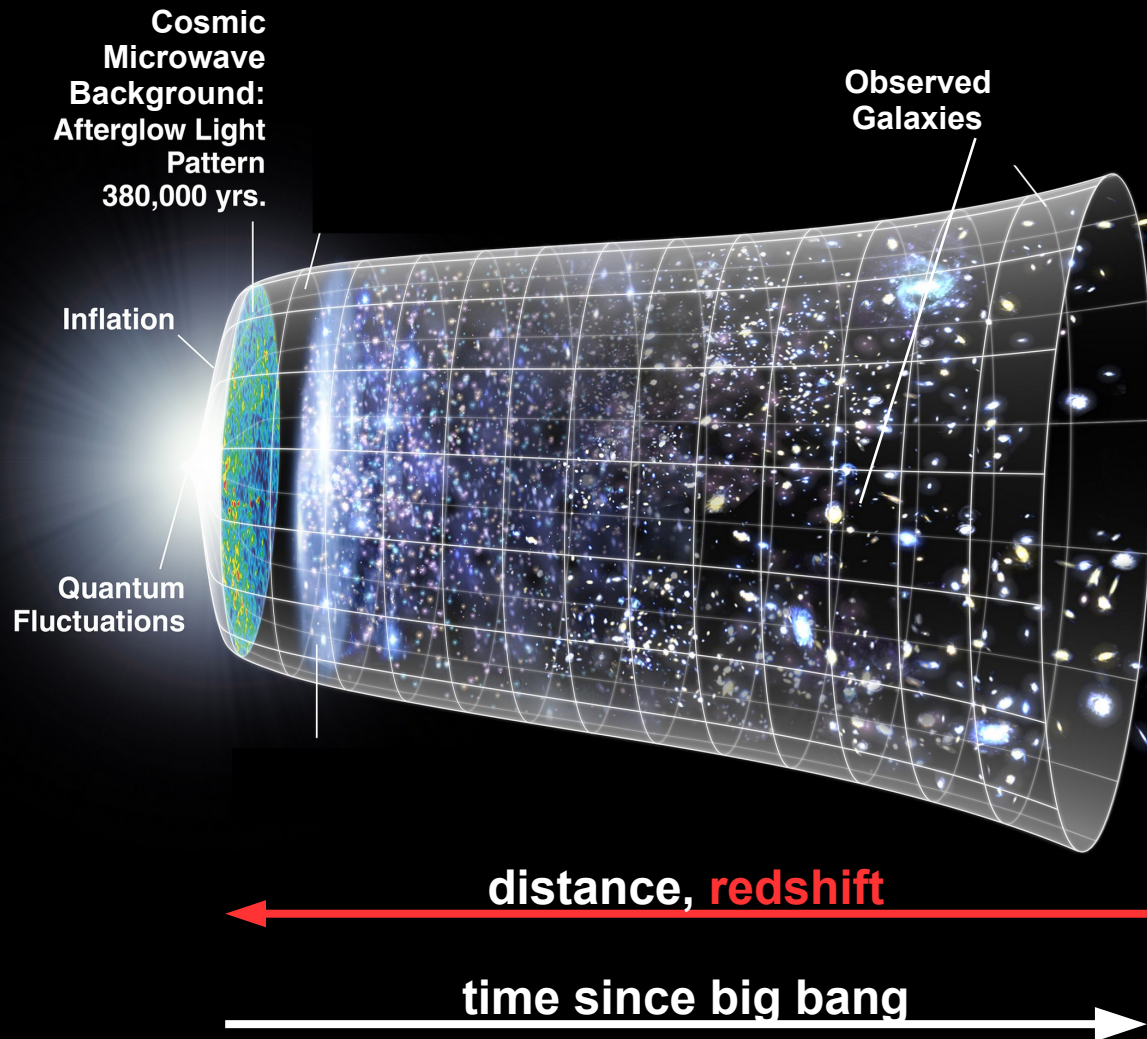
Cosmic Frontier

Λ CDM model:

- 80% of matter is a non-**standard-model** substance
 - “**Dark Matter**”, only interacts via gravity
- 70% of energy is an unknown substance, consistent with cosmological constant / vacuum energy, 10^{-50} x QFT value
 - “**Dark Energy**”, accelerates cosmic expansion, slows down growth of structure

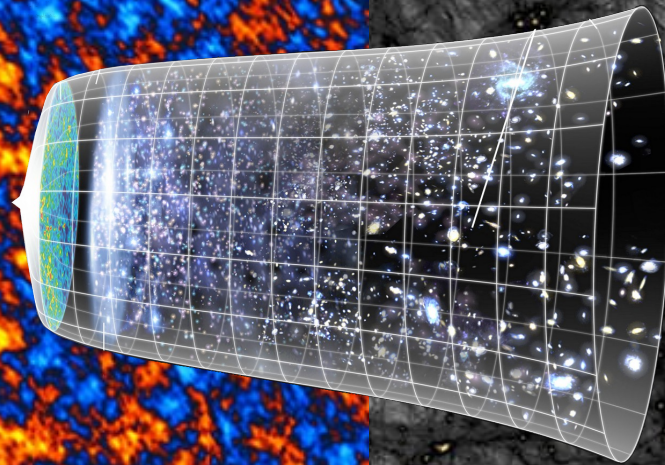


Observing our strange Universe



Structure in the Universe: then and now

CMB temperature,
Planck satellite



Simulated structure today

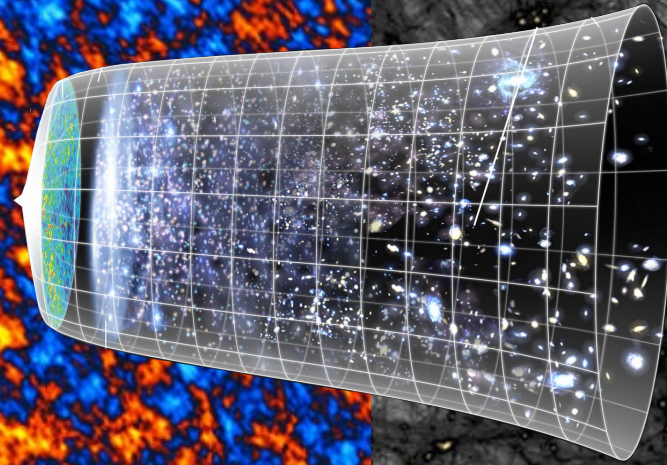
Credit: Ralf Kaehler, Carter Emmart,
Tom Abel, Oliver Hahn / SLAC

10^{10} years later
 10^9 more volume
 10^{-5} vs. $10^{>3}$ density contrast

**Do Dark Matter and a
cosmological constant
correctly extrapolate this?**

Structure in the Universe: then and now

CMB temperature,
Planck satellite



Simulated structure today

Credit: Ralf Kaehler, Carter Emmart,
Tom Abel, Oliver Hahn / SLAC

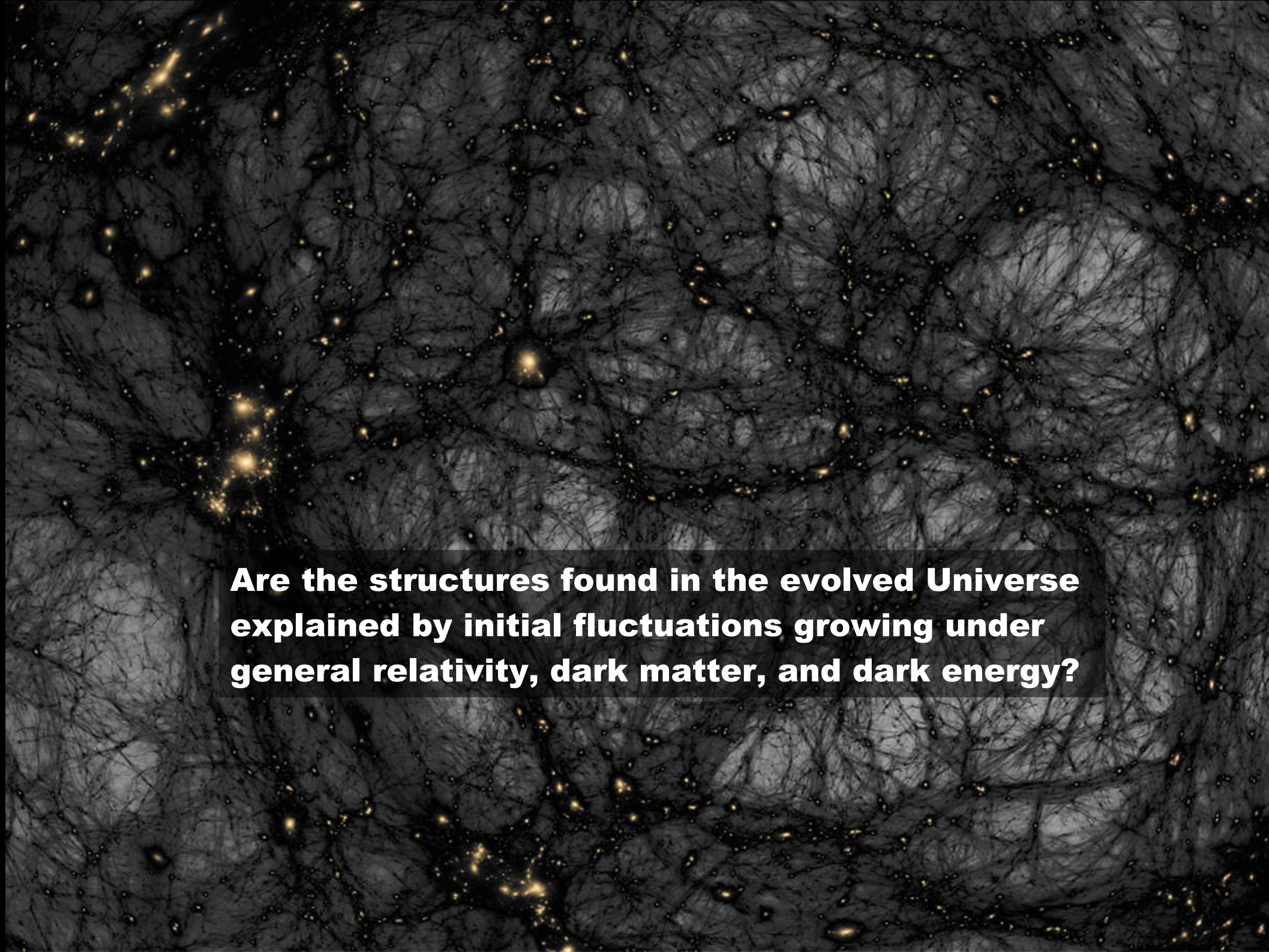
10^{10} years later
 10^9 more volume
 10^{-5} vs. $10^{>3}$ density contrast

Do Dark Matter and a
cosmological constant
correctly extrapolate this?

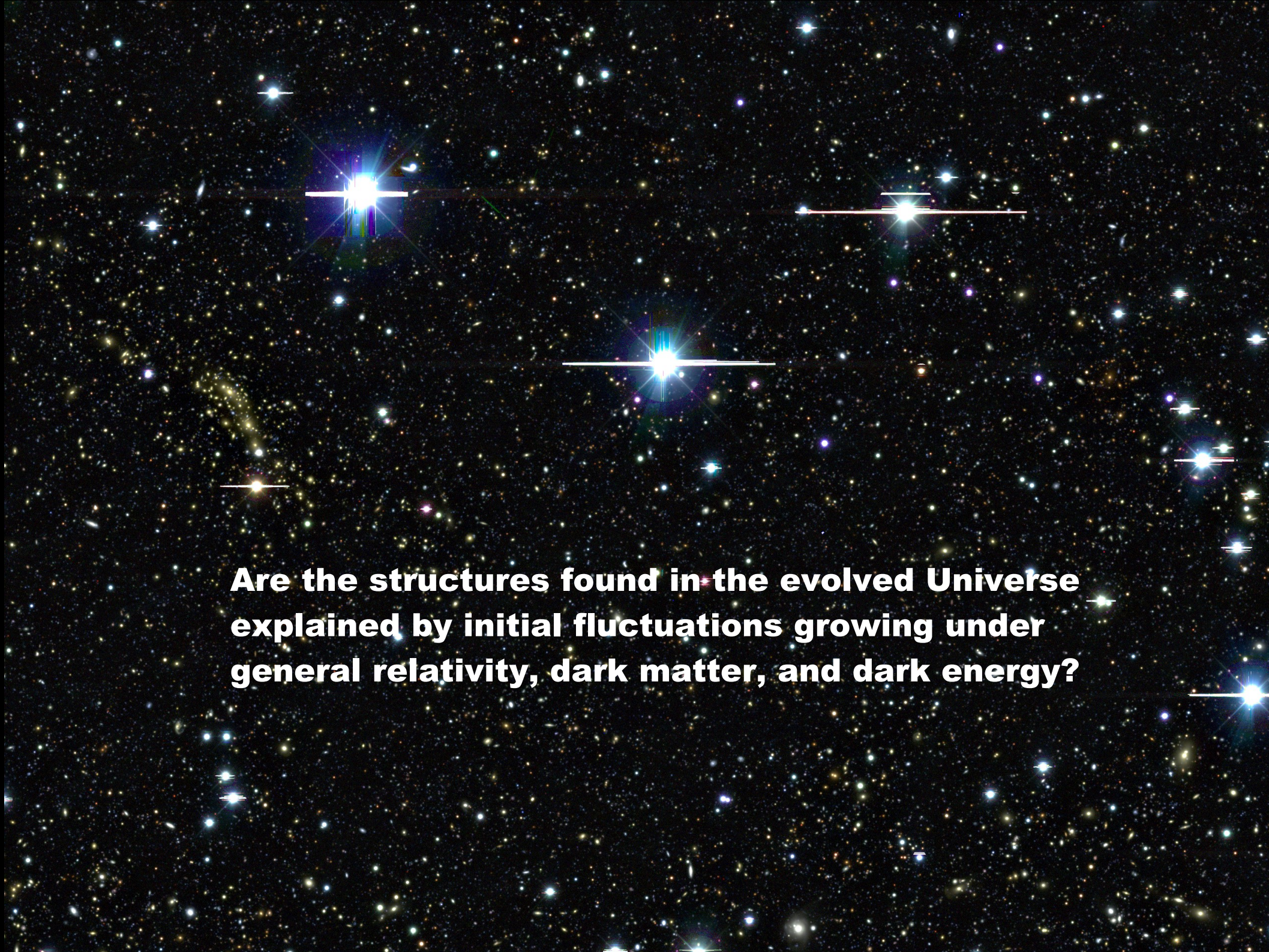
Are data from
early Universe
and **late Universe**
fit by the same parameters?

Do **cosmic expansion**
and growth of **structure**
agree?

Does the dark energy density
change as space expands?
“Equation of state” parameter
 $w = \text{pressure/density}$



Are the structures found in the evolved Universe explained by initial fluctuations growing under general relativity, dark matter, and dark energy?

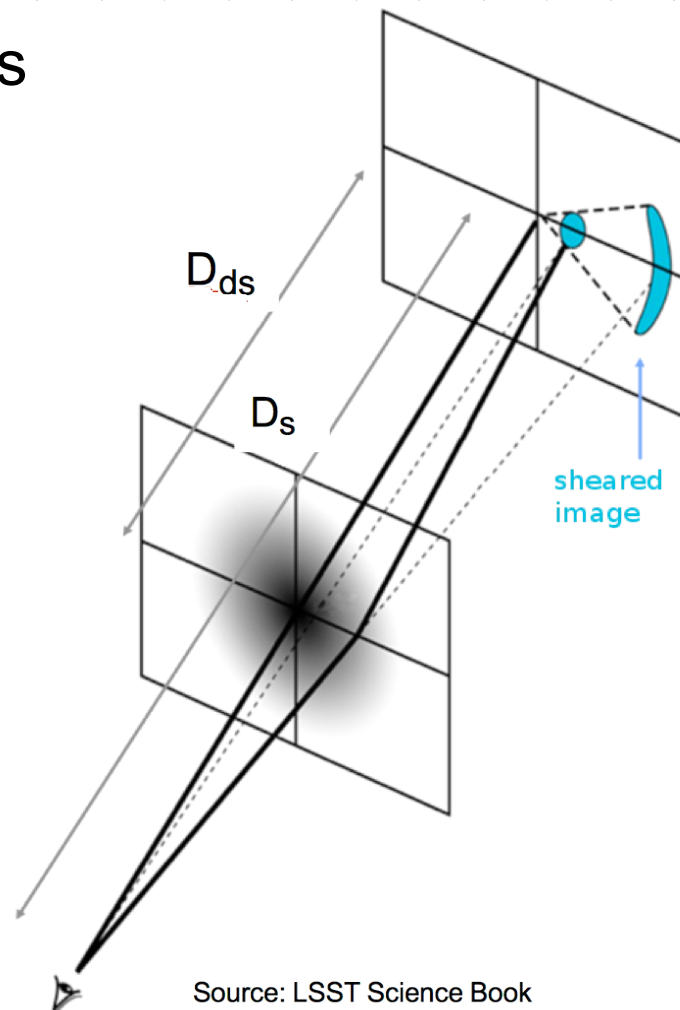
A dense field of stars, likely a star cluster or galaxy core, with several bright stars having prominent horizontal diffraction spikes. The background is dark with many smaller, fainter stars scattered throughout.

Are the structures found in the evolved Universe explained by initial fluctuations growing under general relativity, dark matter, and dark energy?

Gravitational lensing

- When light passes massive structures, it feels gravity and its path gets bent
- This causes shifting, and magnification, and shearing of the galaxy image

$$\gamma_t(\theta) = \langle \kappa(\theta') \rangle_{\theta' < \theta} - \kappa(\theta)$$
$$\kappa = \Sigma / \left[\frac{c^2}{4\pi G} \frac{D_s}{D_d D_{ds}} \right]$$



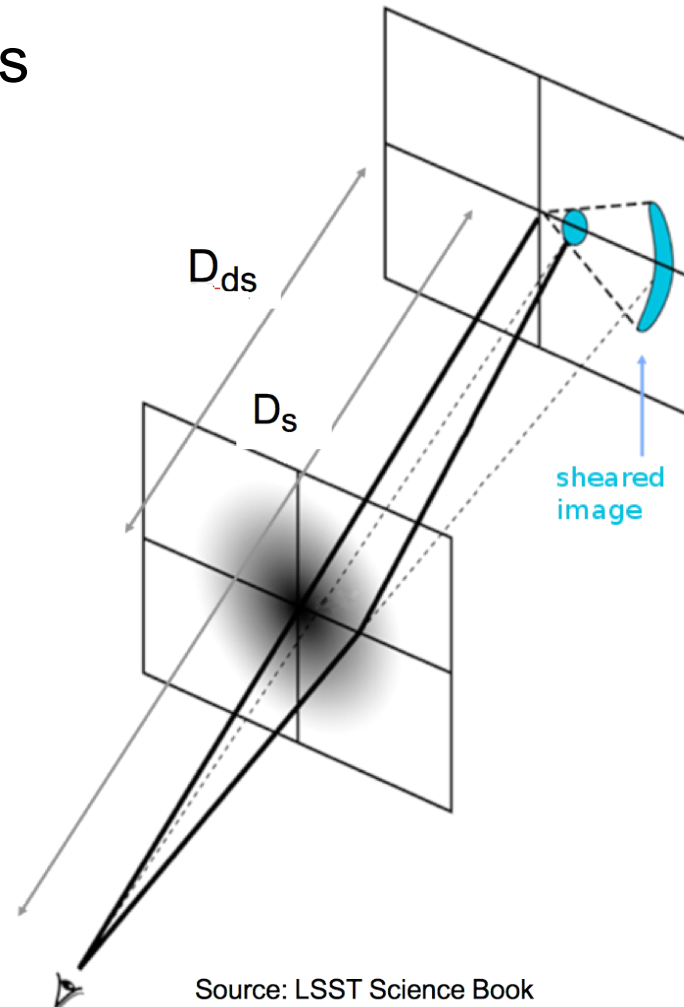
Enables study of structure by connecting observed images to matter density of lens!

Source: LSST Science Book

Gravitational lensing

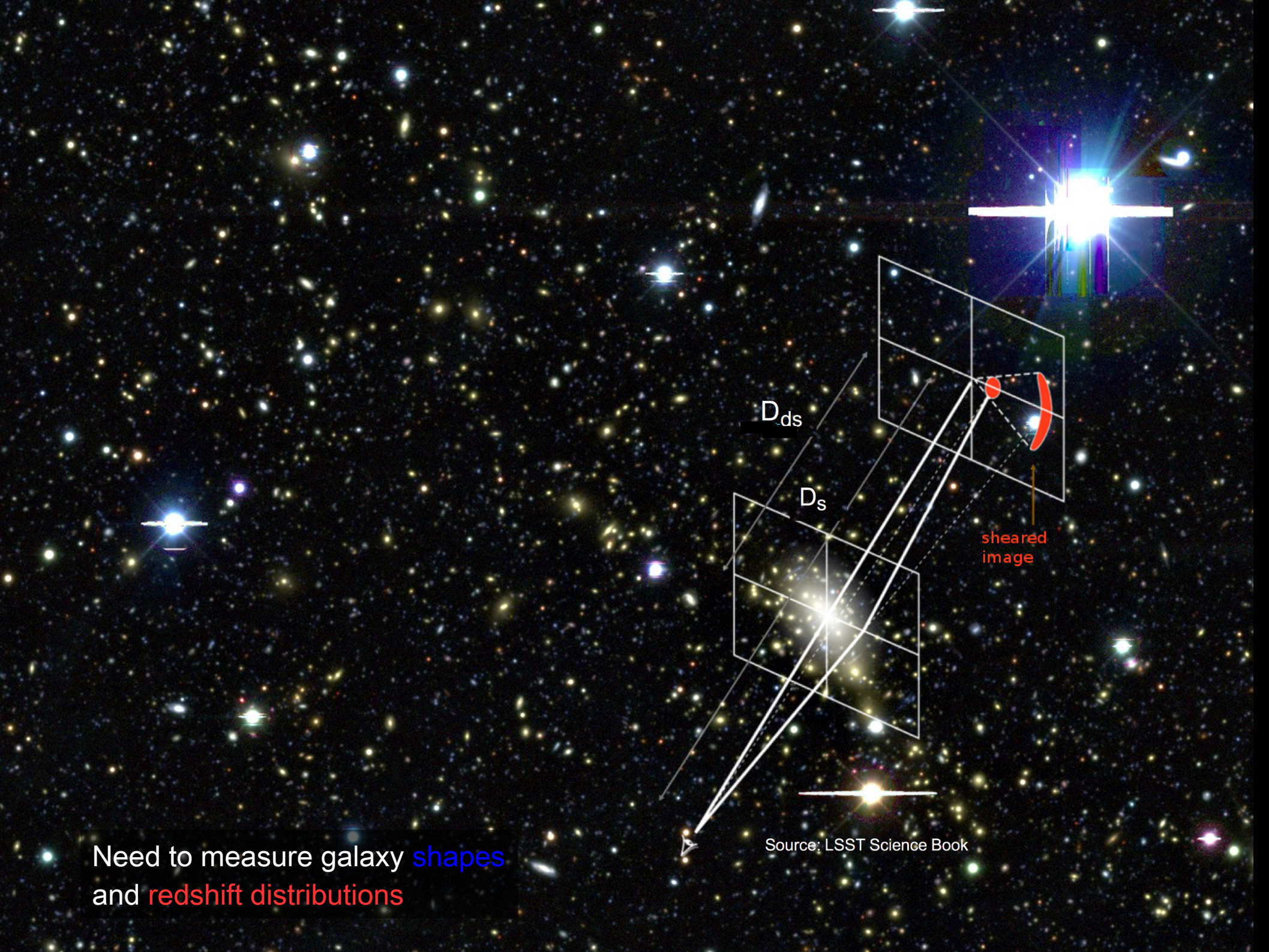
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$$\kappa = \Sigma / \left[\frac{c^2}{4\pi G} \frac{D_s}{D_d D_{ds}} \right]$$



Need to measure galaxy shapes
and redshift distributions

Source: LSST Science Book

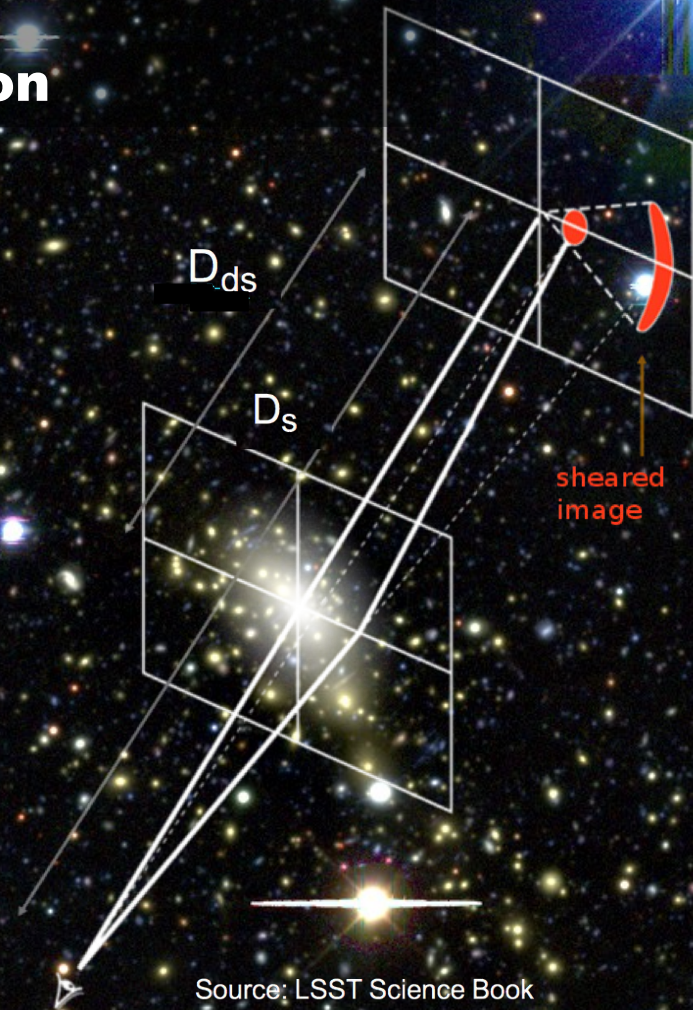


Need to measure galaxy **shapes**
and **redshift distributions**

Source: LSST Science Book

My expertise: **From Pixels to Cosmology**

analyze imaging surveys with **gravitational lensing**,
from accurate **measurements**
to **new statistics of structure**
to **organizing survey collaboration**



Need to measure galaxy **shapes**
and **redshift distributions**

Source: LSST Science Book

Funded by:



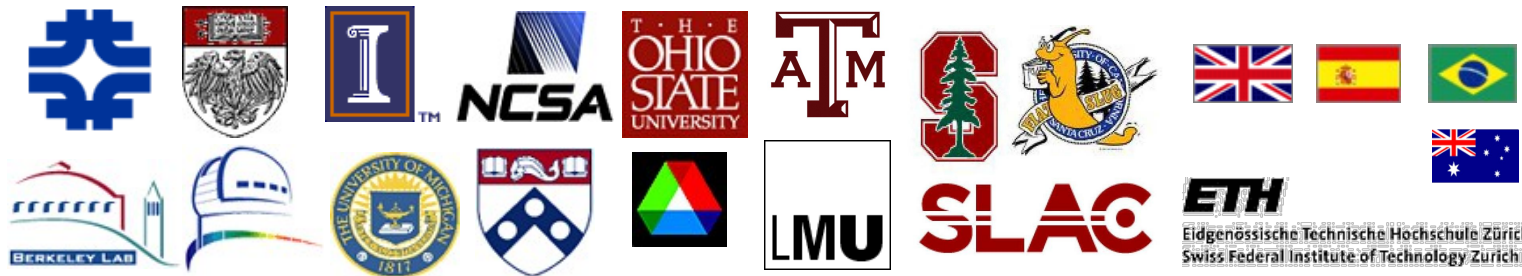
U.S. DEPARTMENT OF
ENERGY

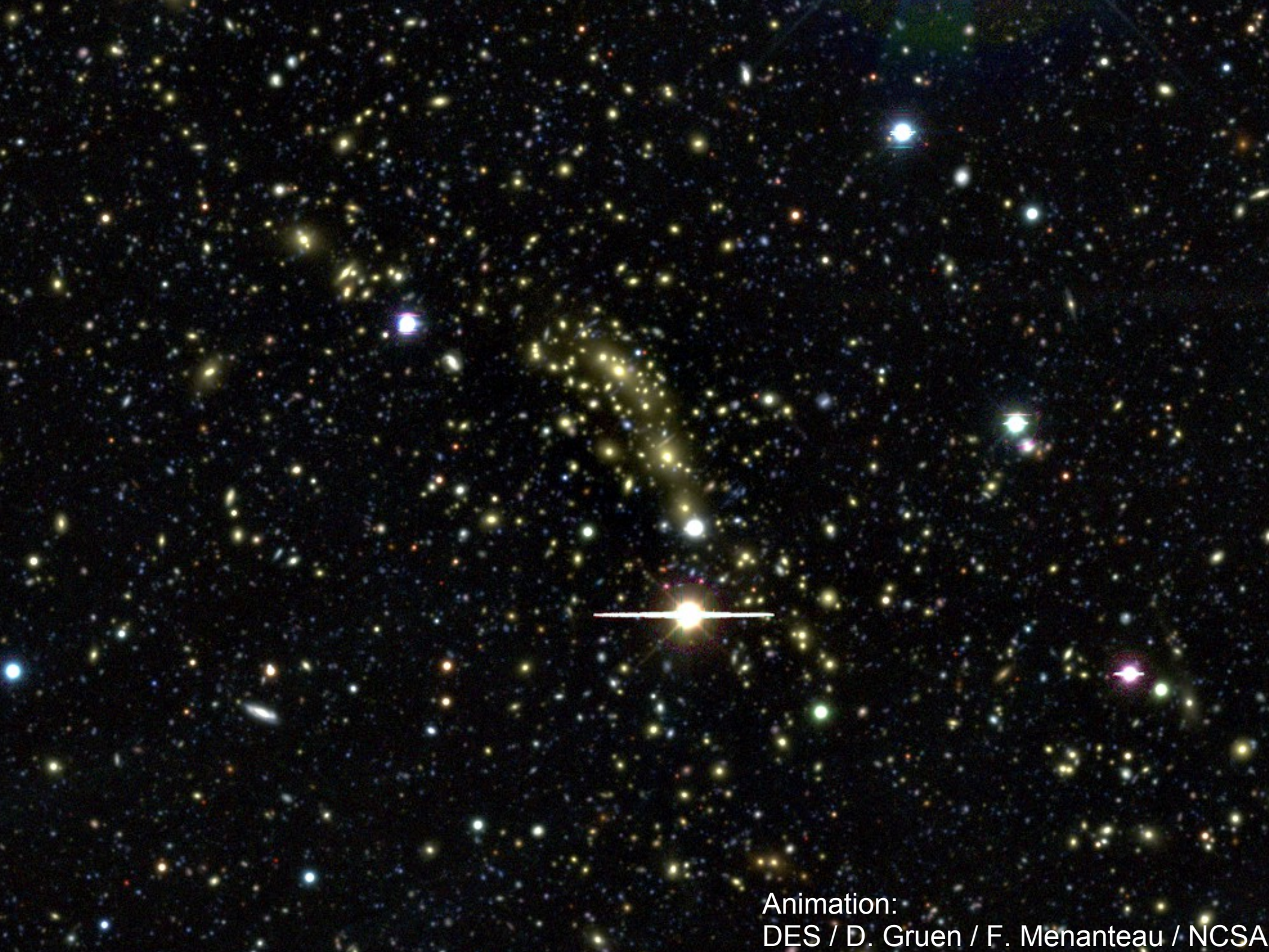
Office of
Science



The Dark Energy Survey

Collaborating
institutions:





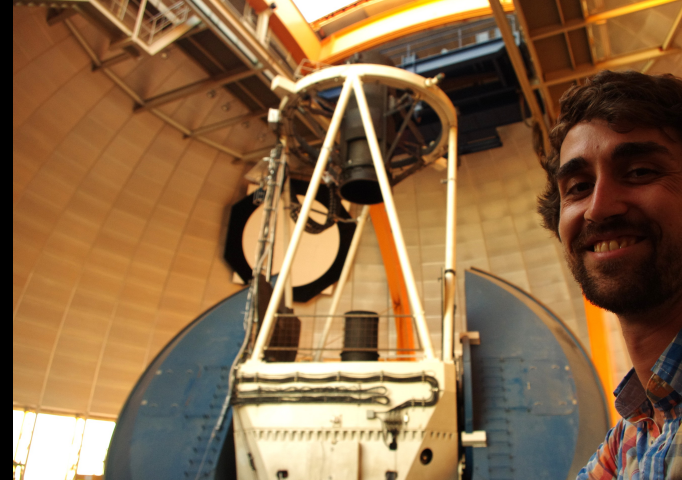
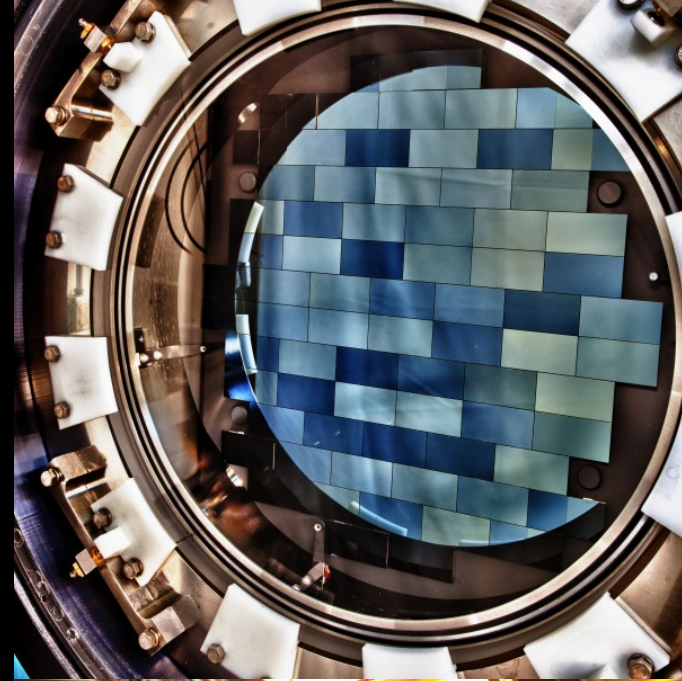
Animation:
DES / D. Gruen / F. Menanteau / NCSA

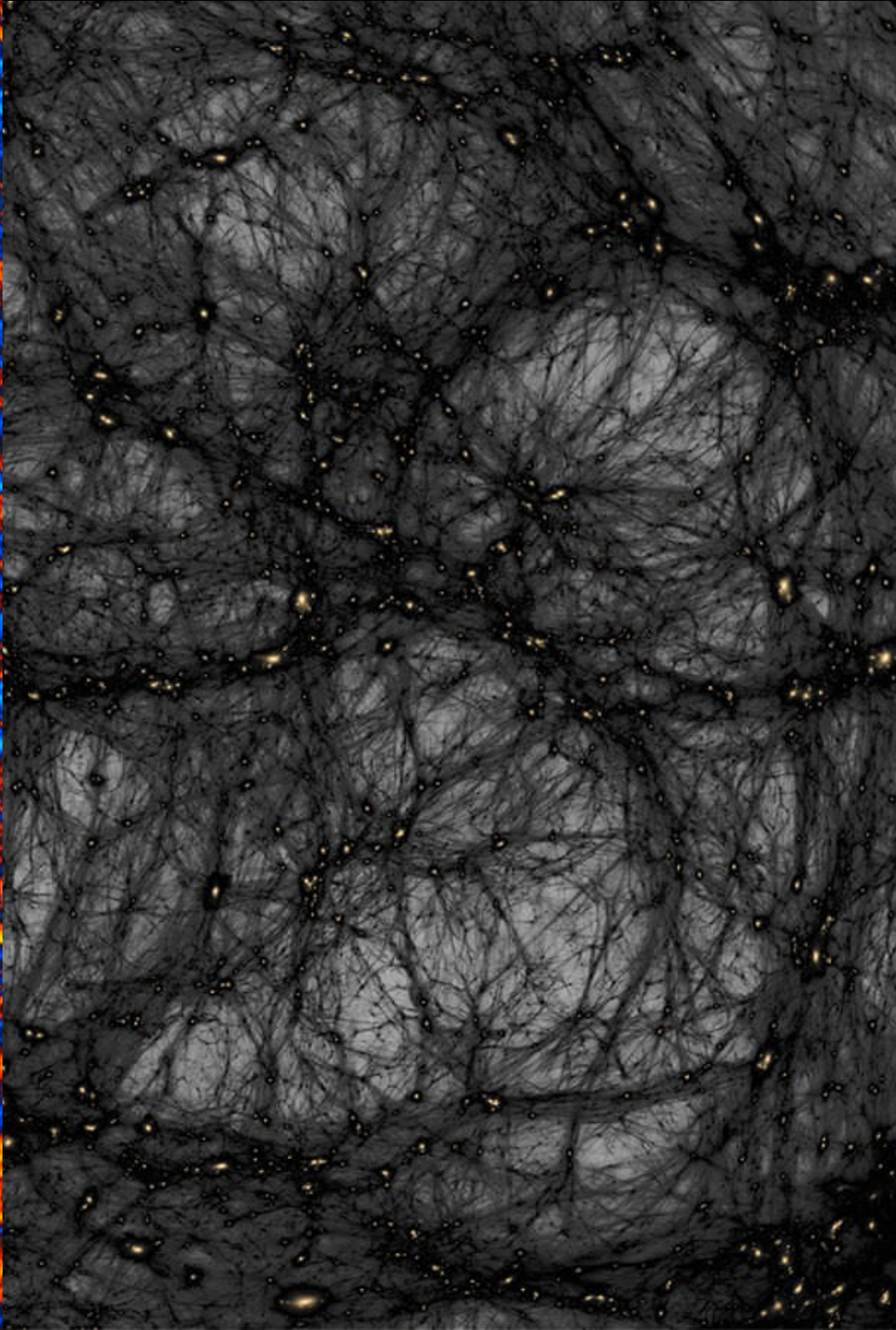
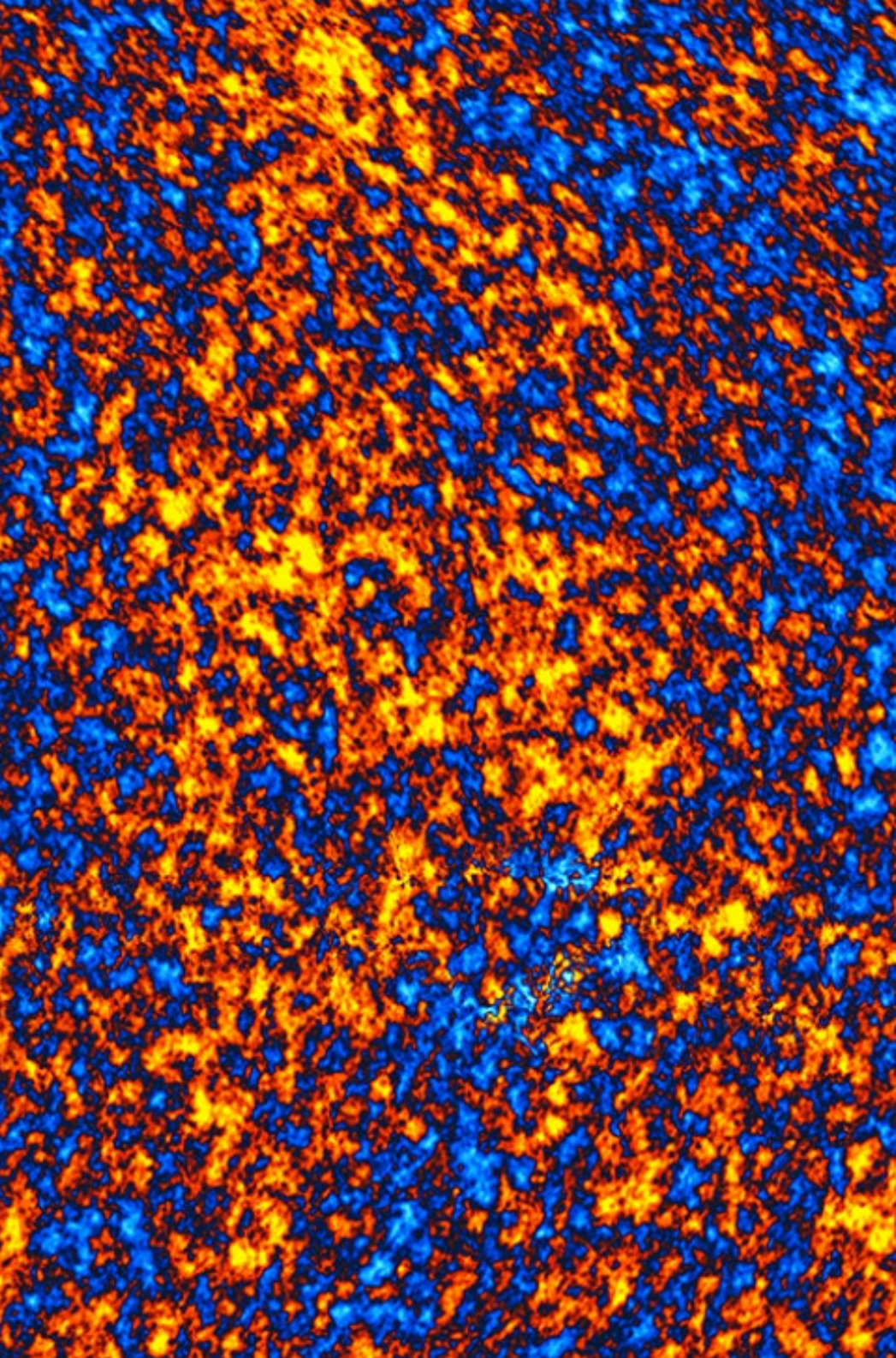
The Dark Energy Survey

- 5000 sq. deg. in 5 bands from Blanco/CTIO, 10 exposures, 5.5 years, >400 scientists
- Primary goal: dark energy equation of state
- Status:
 - Y1 (1300 sq. deg, 40% depth): key results published / in review
 - Y3 (4000 sq. deg, 50% depth): data processed, vetting catalogs
 - We finished survey as planned on Jan 10

Basic Y3 data and full Y1 value added data public

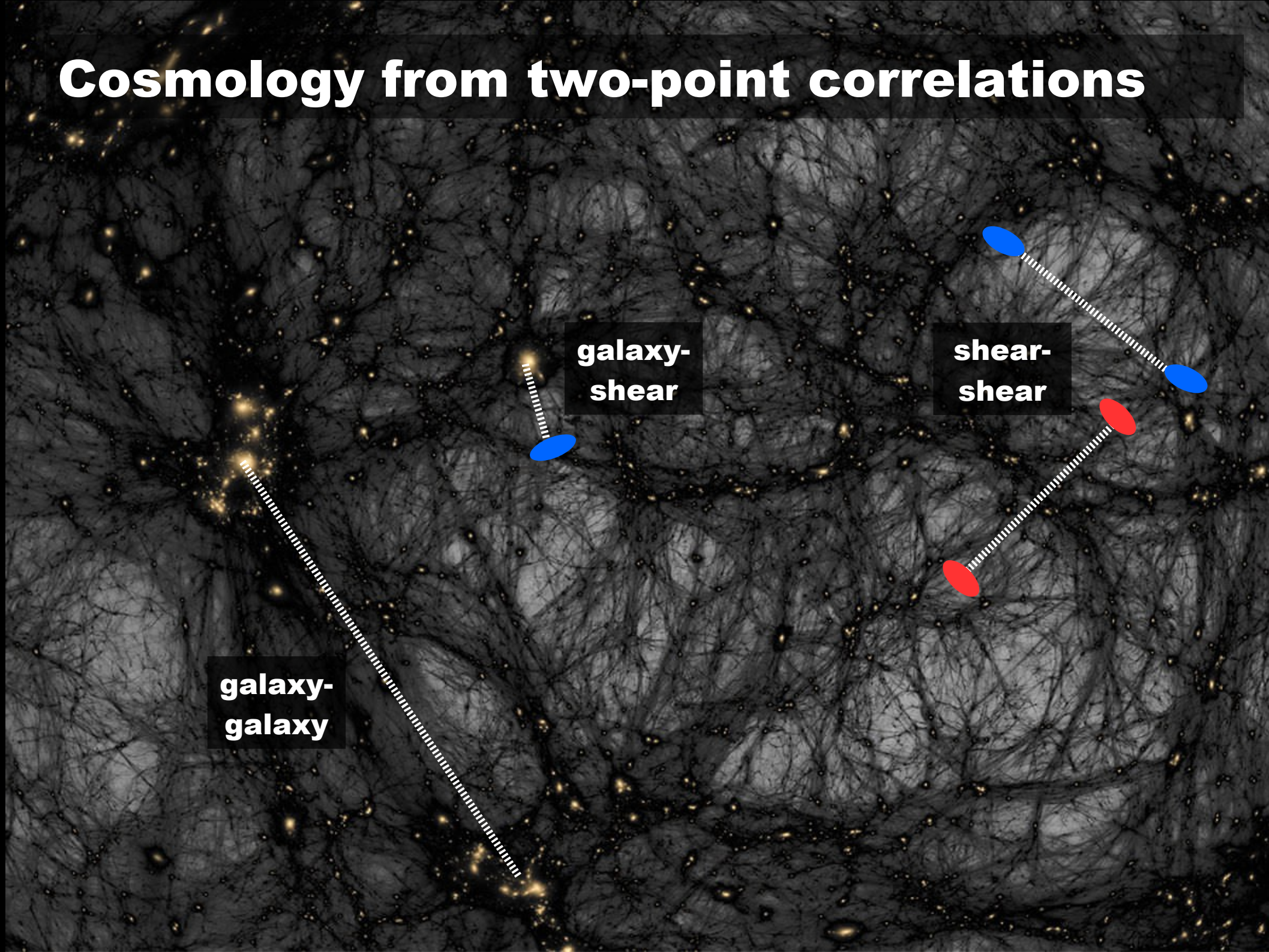
www.darkenergysurvey.org





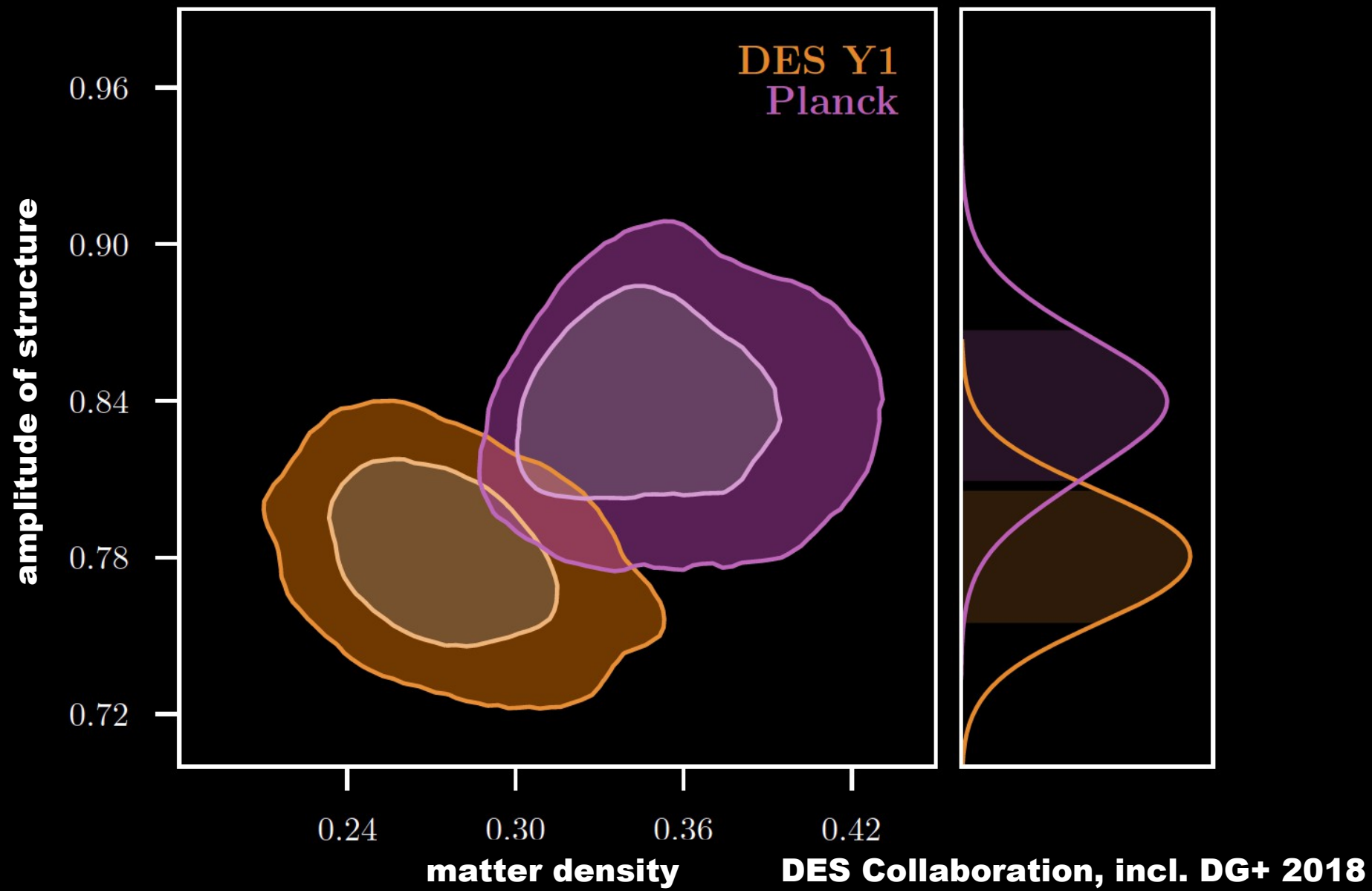
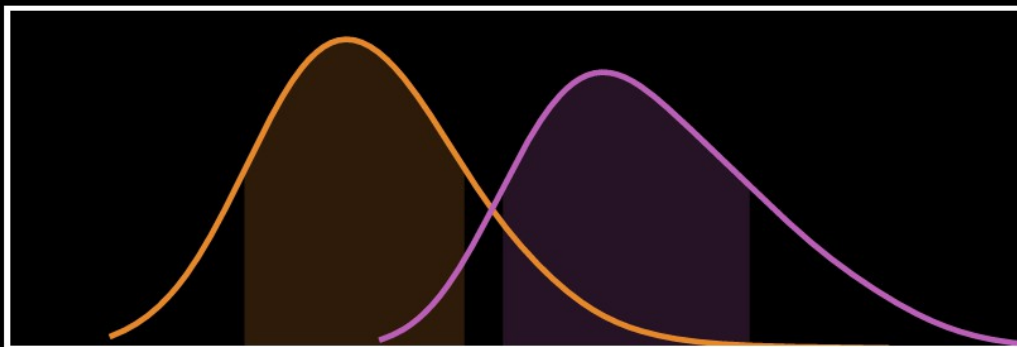
Cosmology from two-point correlations

galaxy-
galaxy



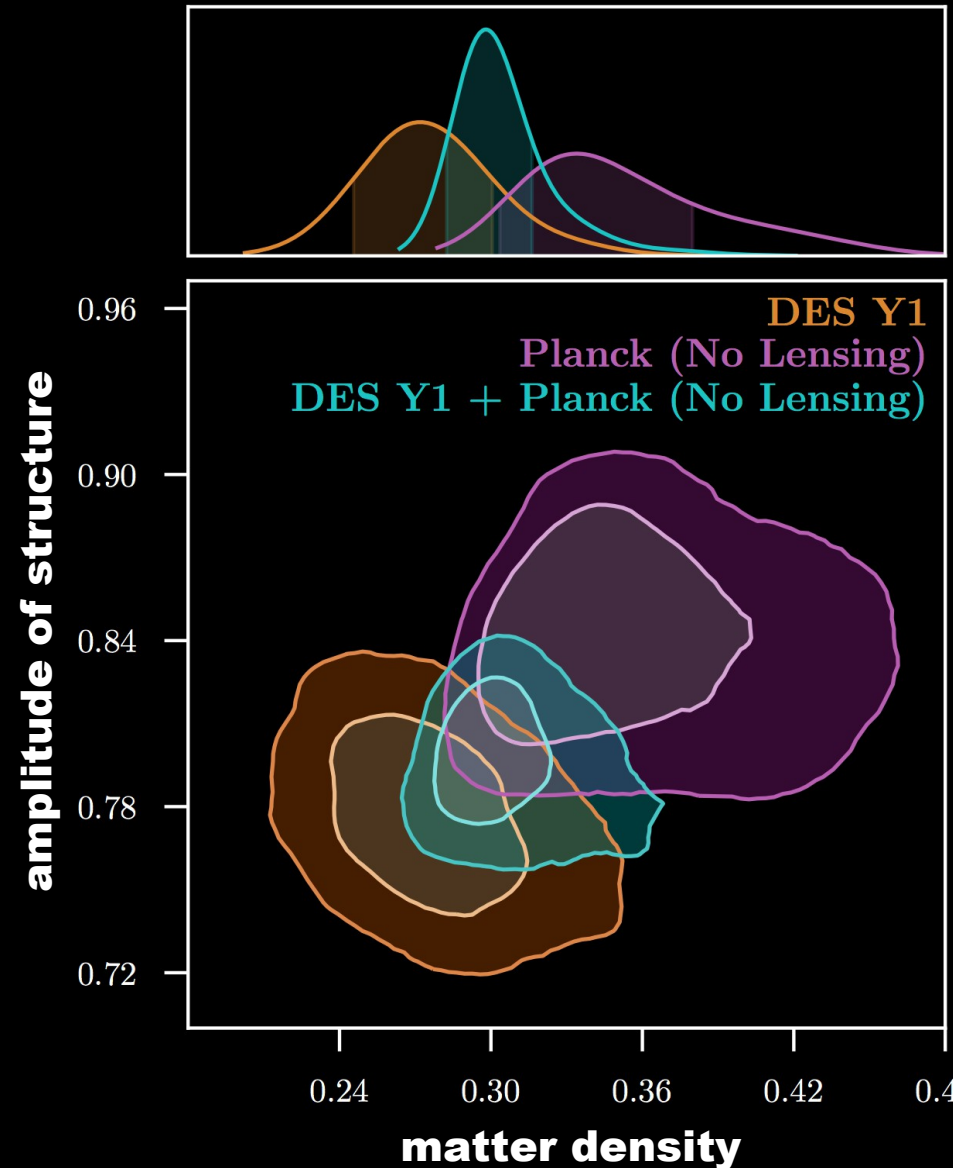
galaxy-
shear

shear-
shear

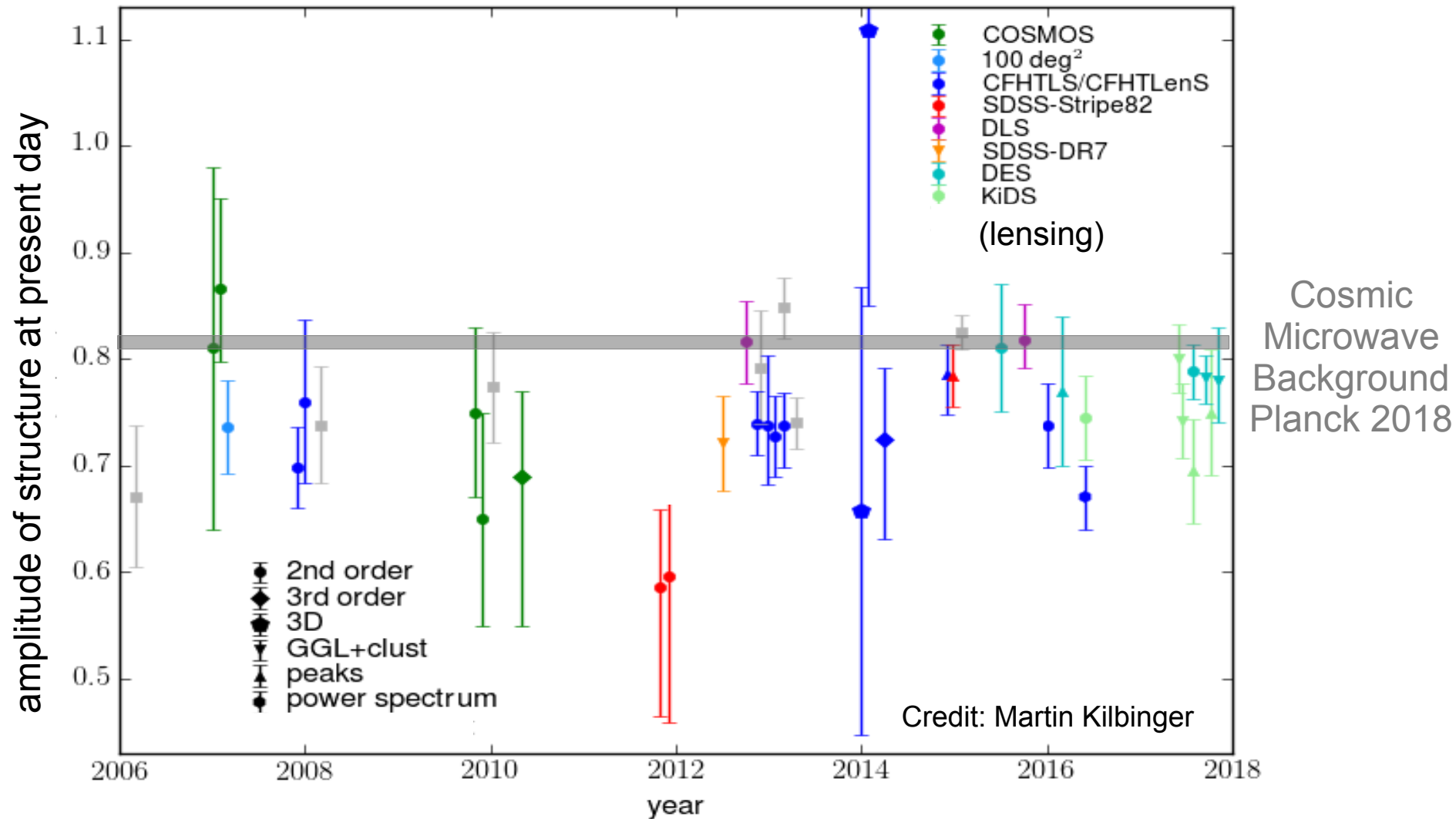


Consistency of evolved structure with CMB

- DES and CMB constrain matter density and S_8 with equal strength
- Bayes Factor good – no evidence for inconsistency
- Difference in central values $1-2\sigma$, same direction as earlier results

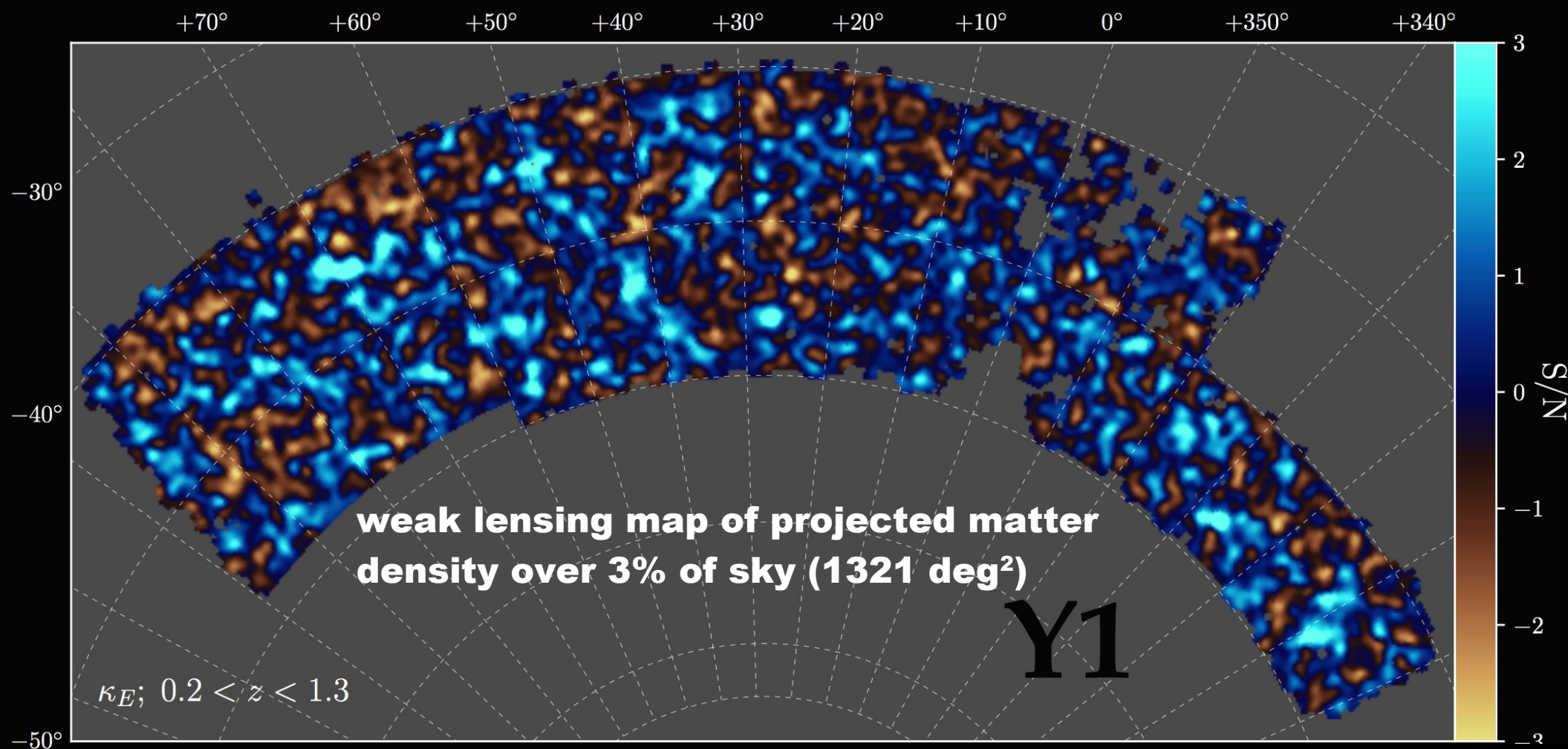


Is present-day structure low?

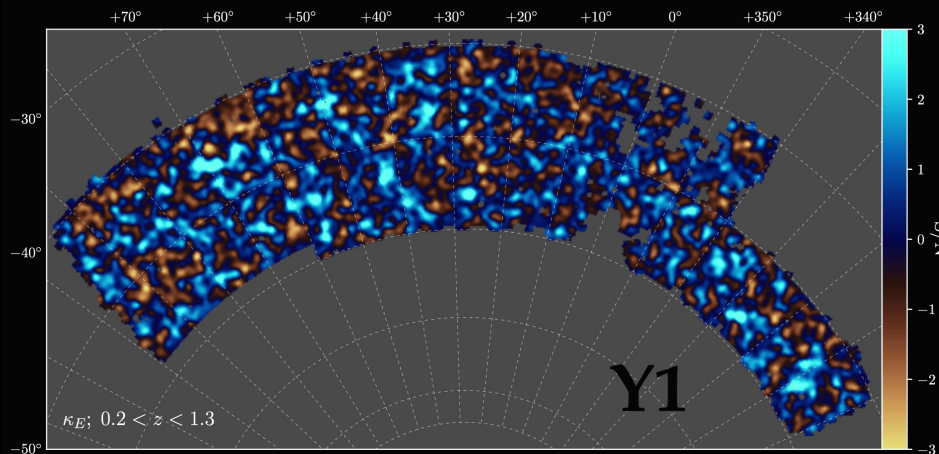


- recent studies have claimed 2-3 σ offset from Planck CMB
- interpretations differ – statistical fluke, systematics, crack in Λ CDM?

DES Y1

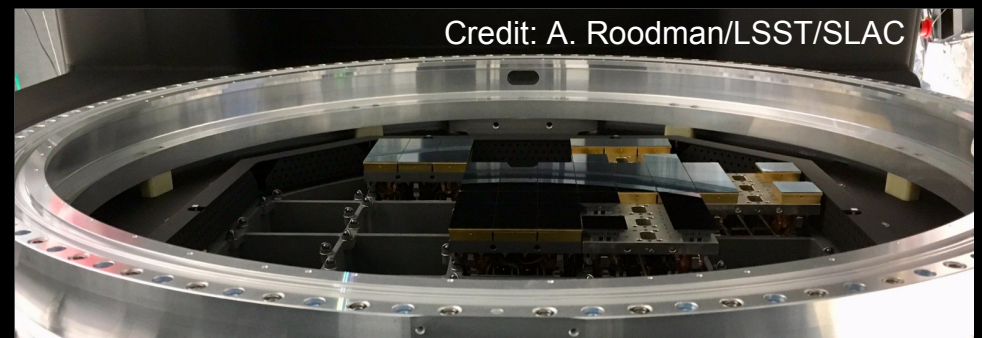


DES Y1 ... and beyond



Credit: LSST/AURA

Release	Year	Statistical power
DES Y1	2017	35M galaxies, $i \sim 22.5$ 1,321 sq. deg, 6/sq. arcmin $\langle z \rangle \sim 0.6$
DES Y3	2019	93M galaxies, $i \sim 22.5$ 4,100 sq. deg, 6/sq. arcmin $\langle z \rangle \sim 0.6$
DES Y6	2021	200M galaxies, $i \sim 23.5$ 5,000 sq. deg, 11/sq. arcmin $\langle z \rangle \sim 0.8$
LSST Y1	~ 2023	1200M galaxies 18,000 sq. deg, 18/sq. arcmin $\langle z \rangle \sim 1.0$



With great statistical power comes great systematic responsibility

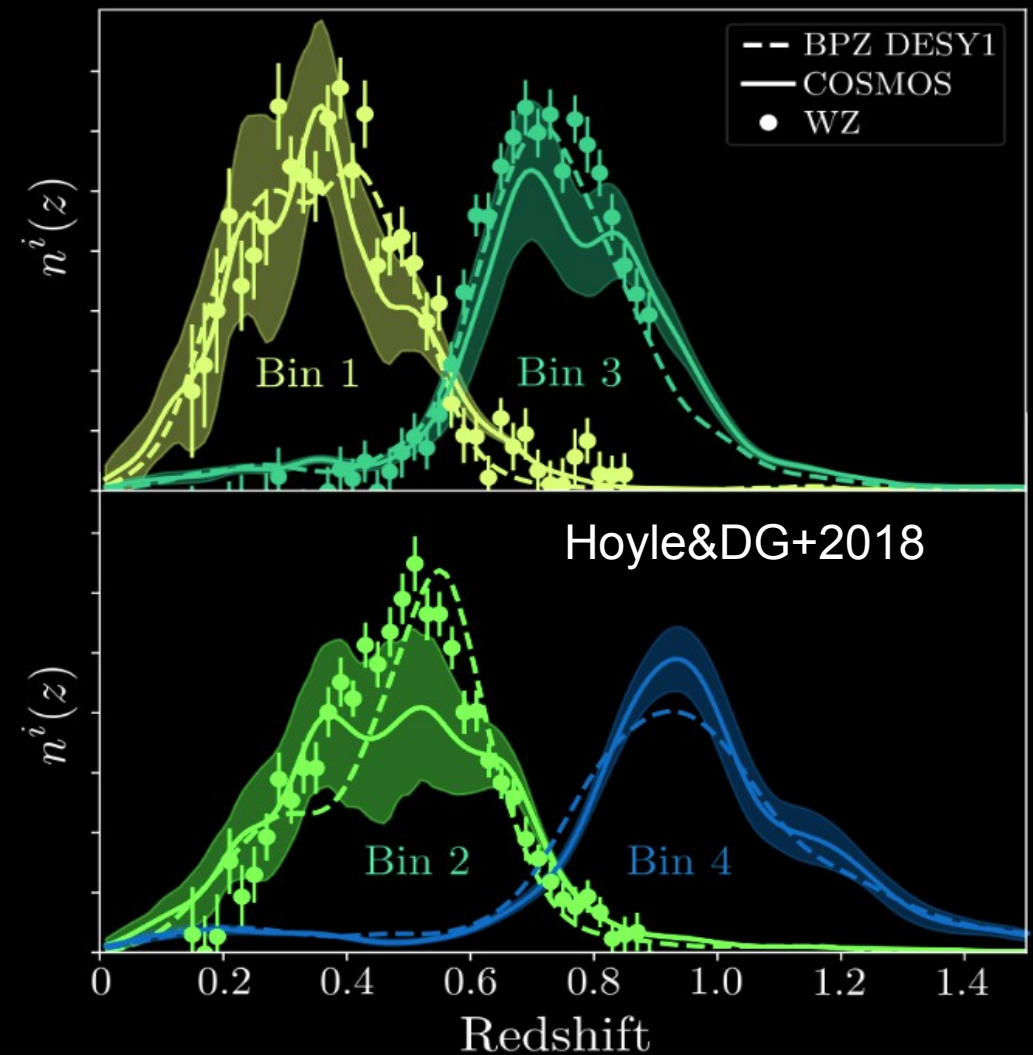
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LSST Y1	~ 2023	1200M galaxies 18,000 sq. deg, 18/sq. arcmin $\langle z \rangle \sim 1.0$

Keeping up in methodology with the gain in data volume will be a challenge

With great statistical power comes great systematic responsibility: Y1

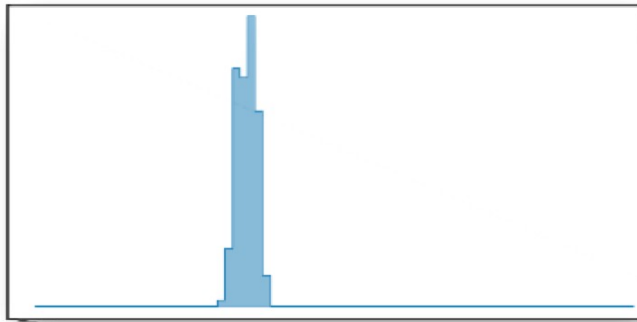
- two independent galaxy **shape** measurement algorithms, bias $<1.3\%$ (Zuntz, Sheldon, incl. DG+2018)
- two independent calibrations of **redshifts** of four lensing source bins (Hoyle&DG+2018)
- two independent, blinded cosmological **inferences**, tested with simulations (Krause&Eifler, incl. DG+2018; MacCrann&DeRose, incl. DG+2018)

COSMOS + clustering agree, ~ 0.015 uncertainty on $\langle \text{redshift} \rangle$



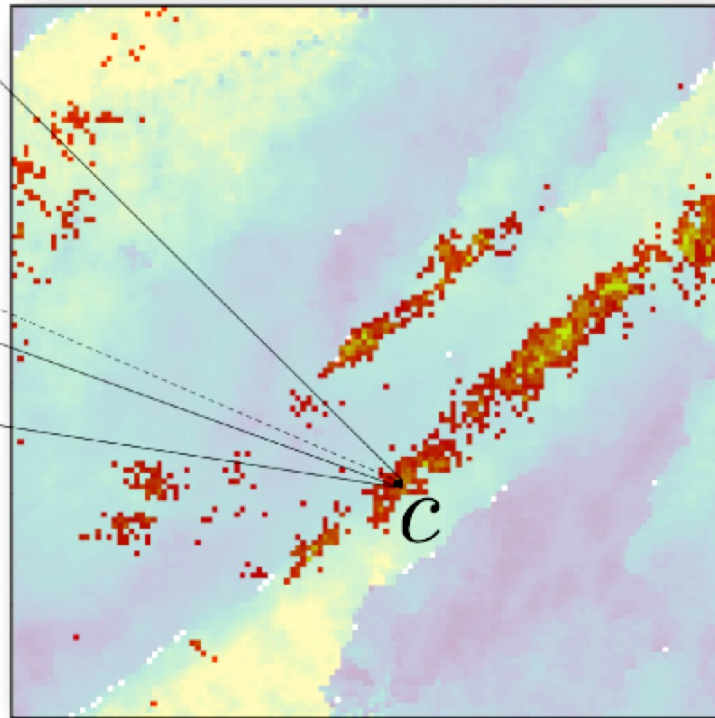
With great statistical power comes great systematic responsibility

Redshift distribution



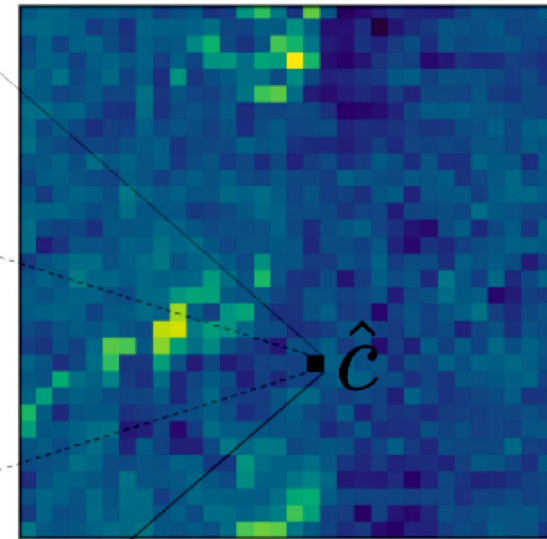
$$p(z|c)$$

Deep SOM



$$p(c|\hat{c}, \hat{s})$$

Wide SOM



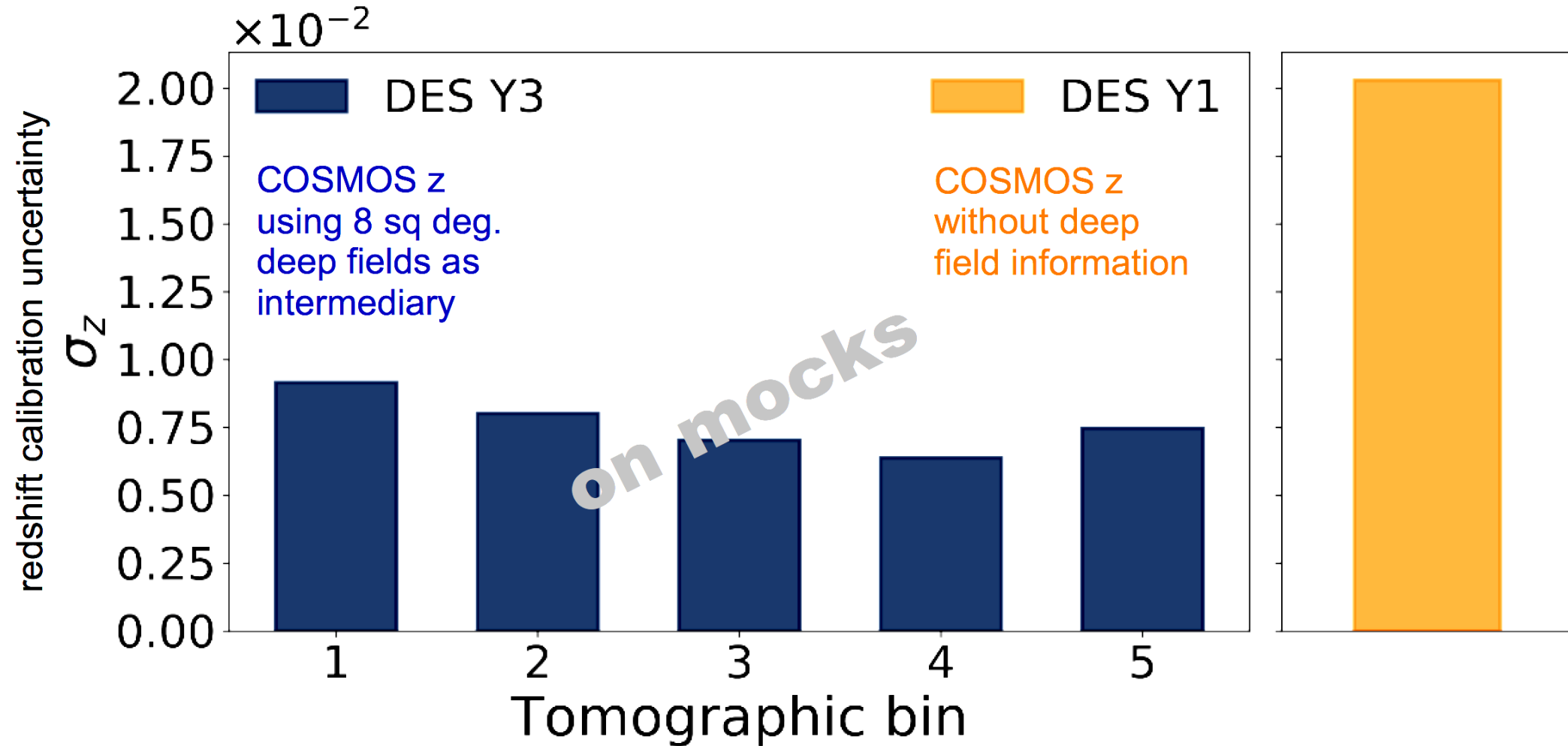
Redshift sample
e.g. COSMOS30,
PAU, spec-z
with ugrizYJKs

Deep *photometric* sample
with ugrizYJKs

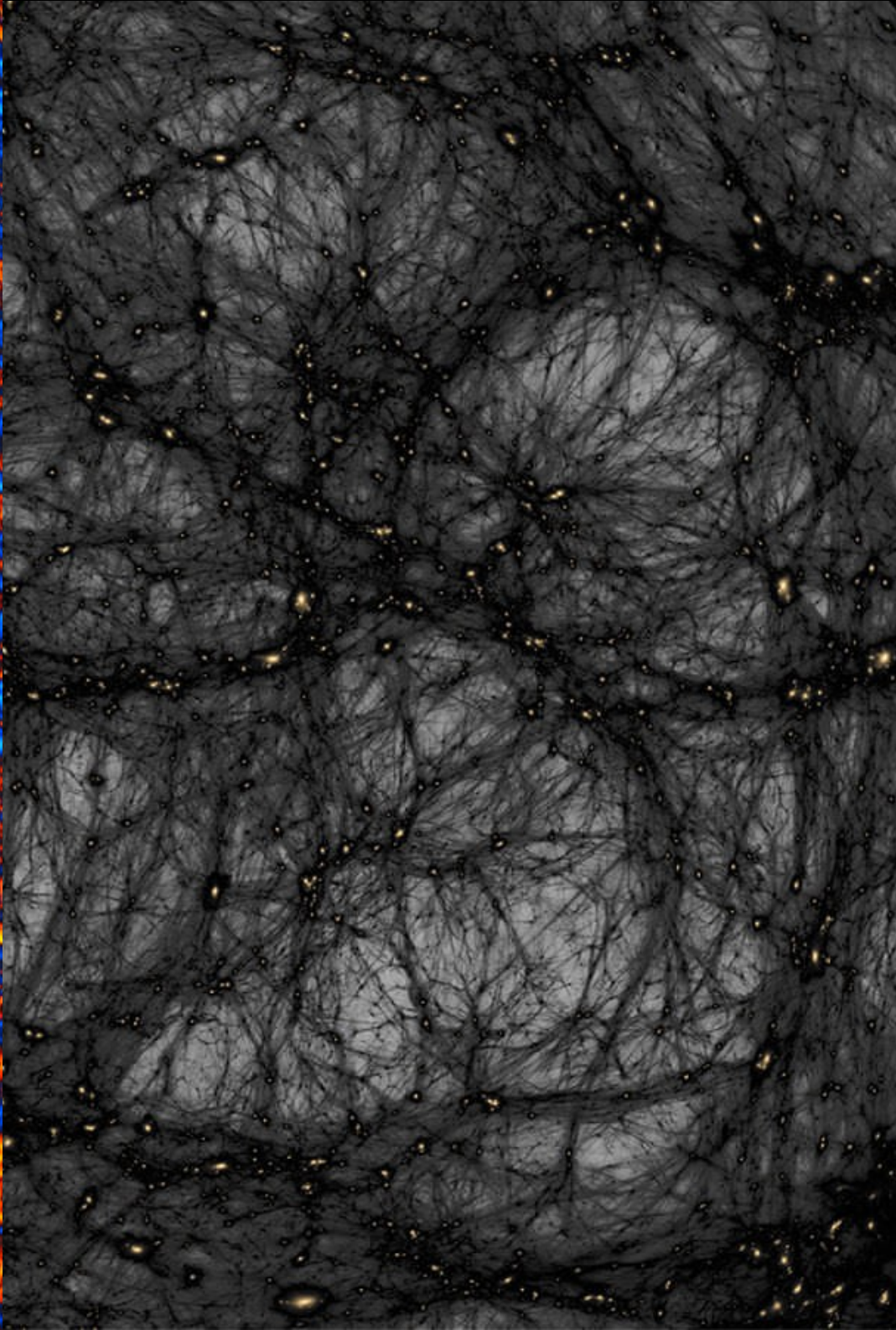
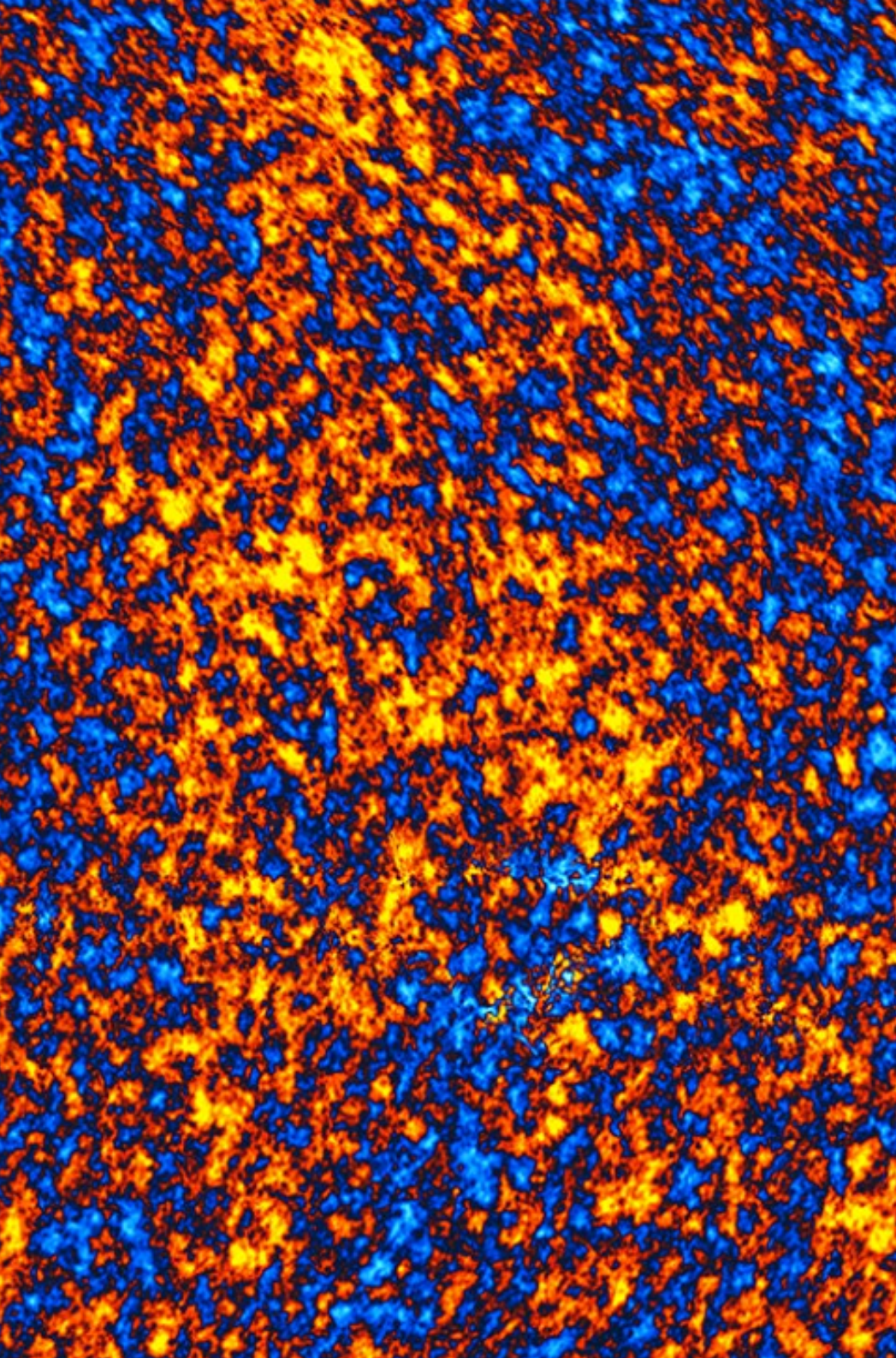
Wide sample
with few bands

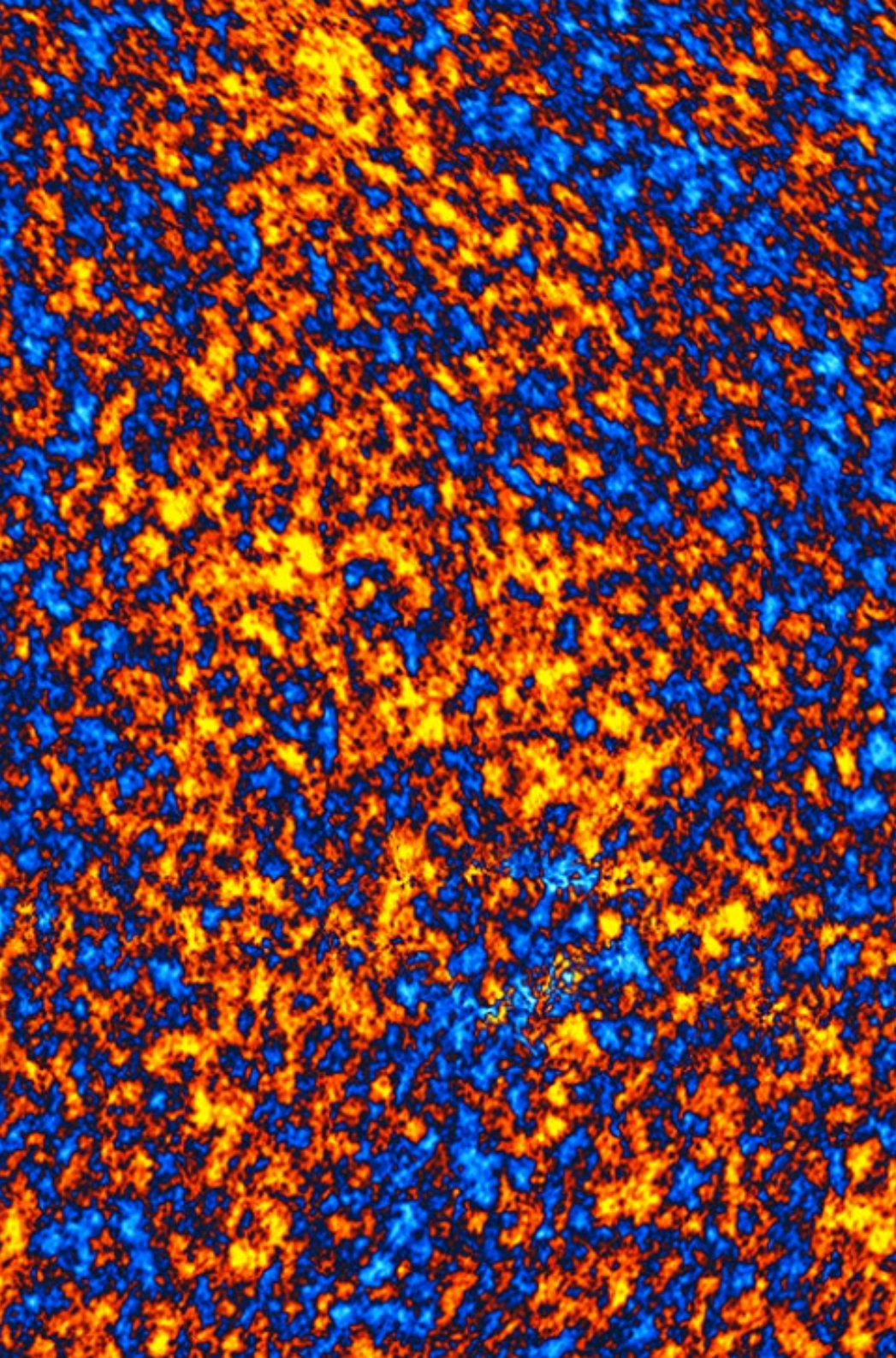
We know a way forward for redshift calibration using multi-band surveys + spectra
Buchs, Davis, DG+ 1901.05005

With great statistical power comes great systematic responsibility



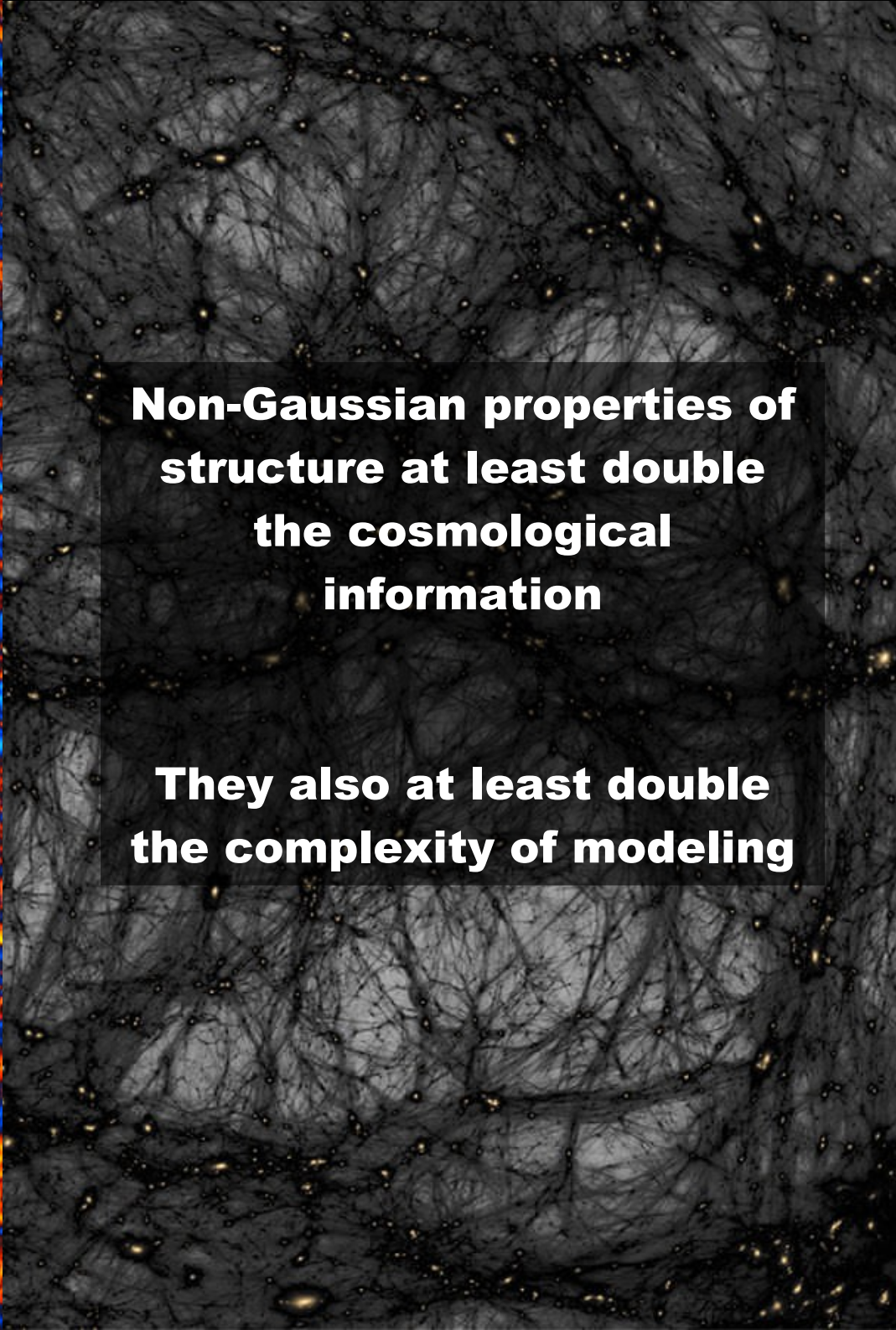
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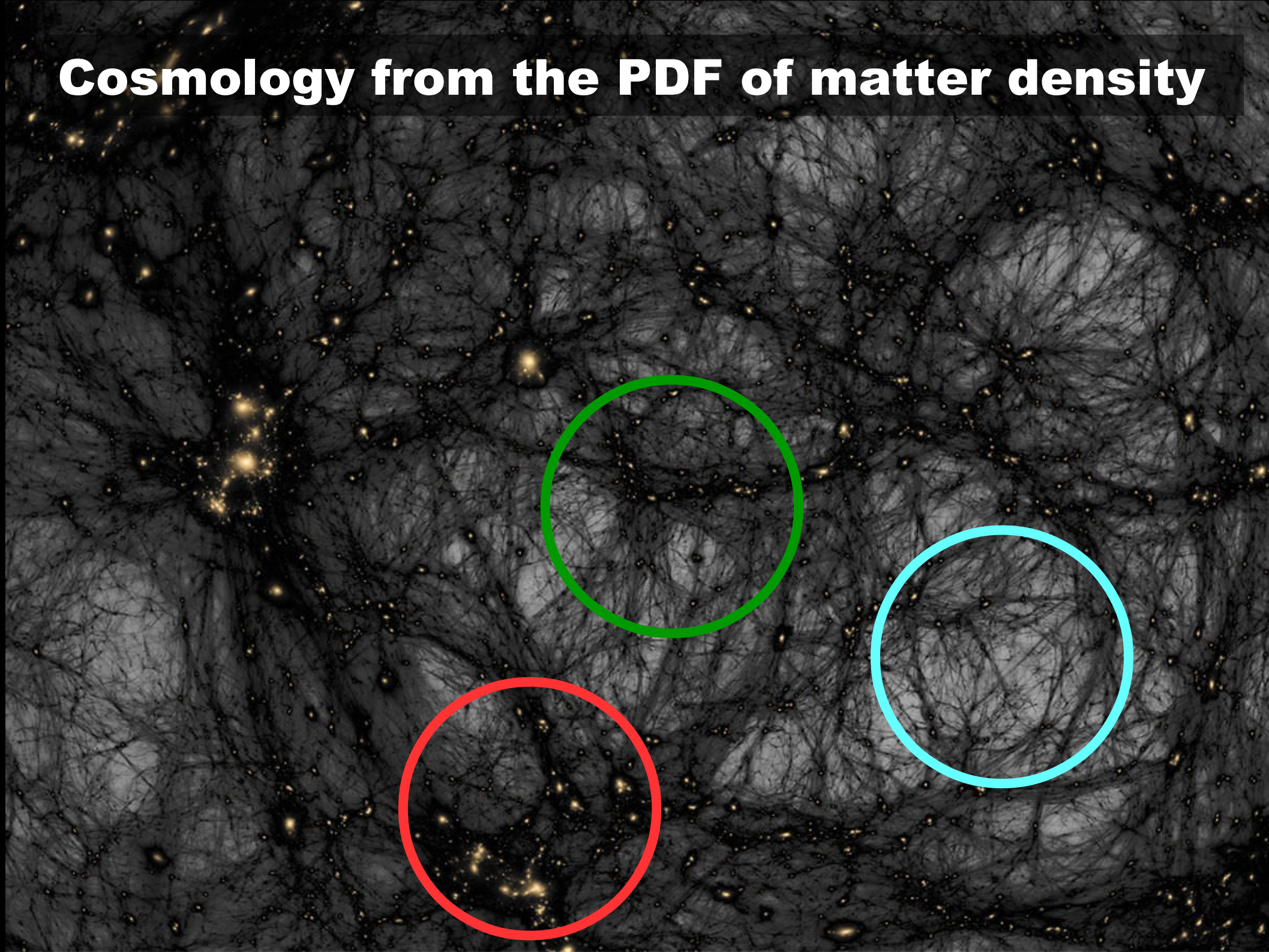


**Non-Gaussian properties of
structure at least double
the cosmological
information**

**They also at least double
the complexity of modeling**

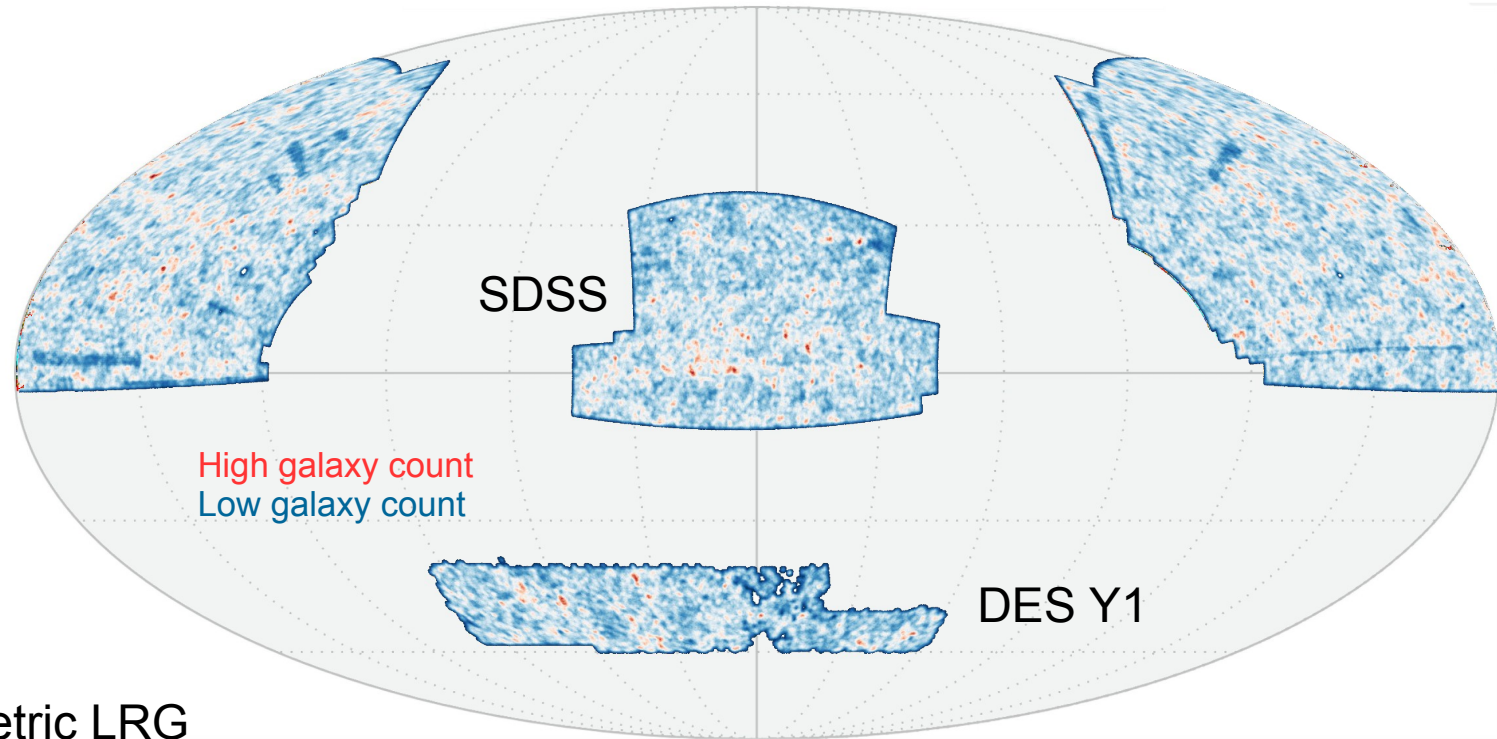
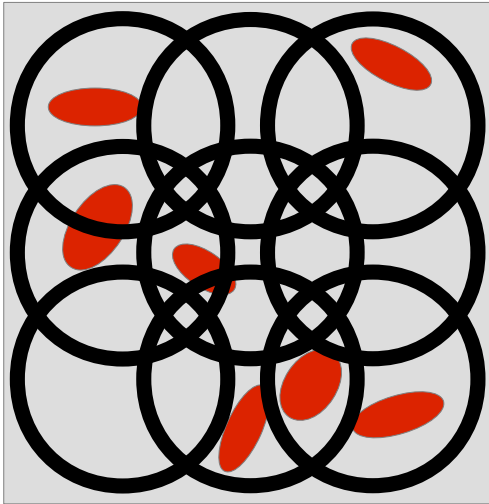



Cosmology from the PDF of matter density



Cosmology from matter/galaxy PDF

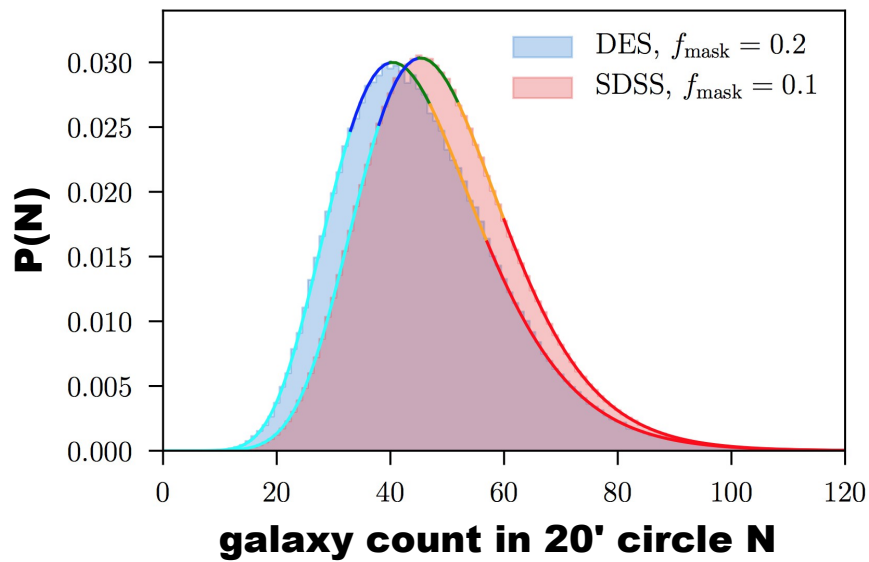
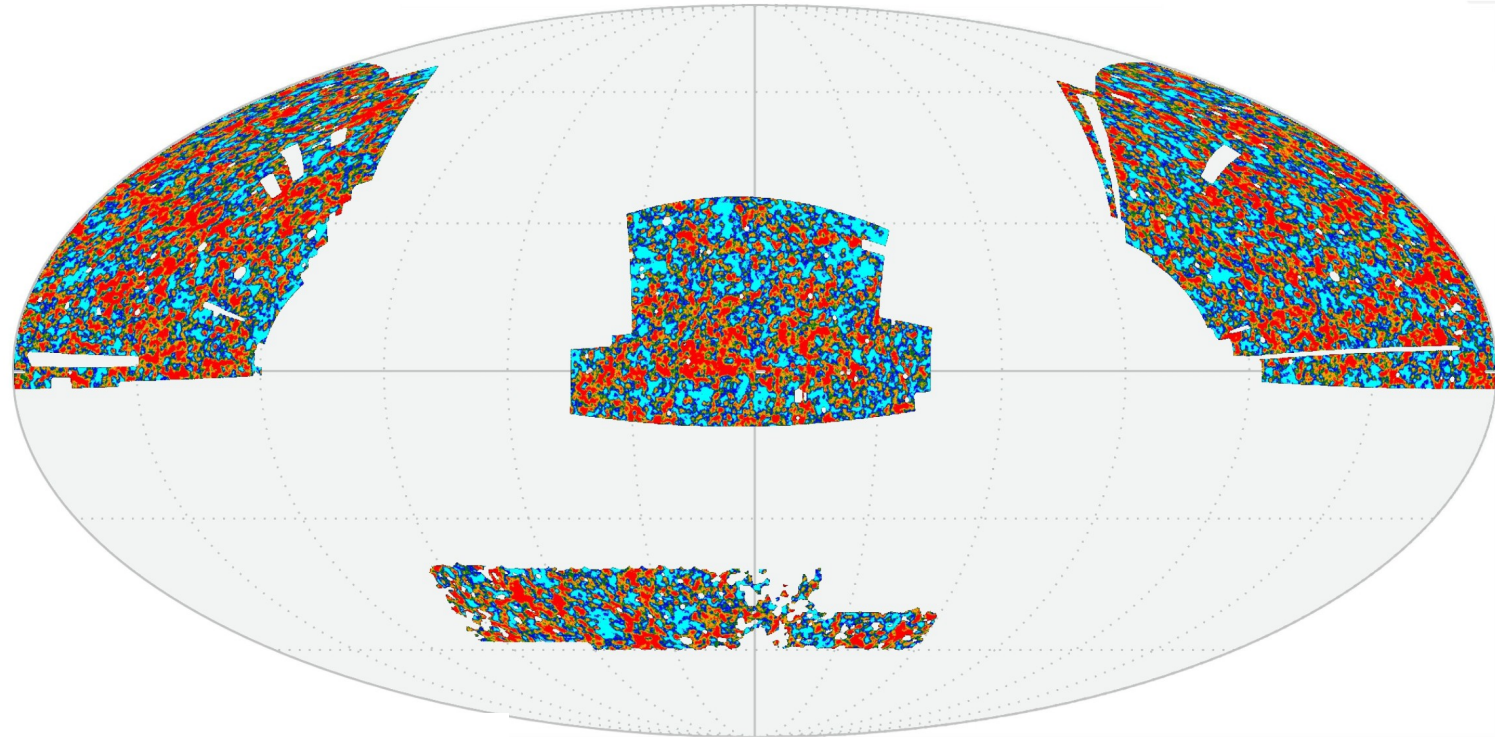
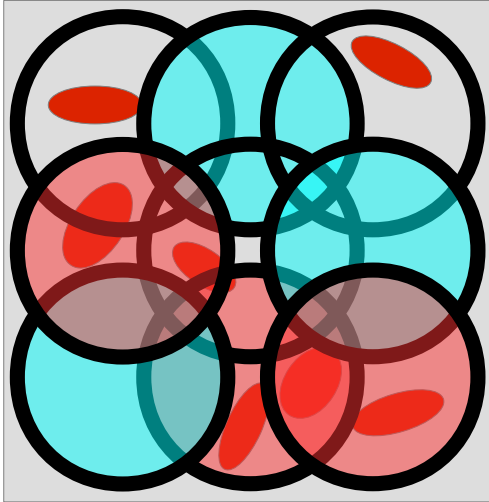
Step 1: Count galaxies in circles



 = redMaGiC photometric LRG
 $0.2 < z < 0.45$, $L > 0.5L^*$

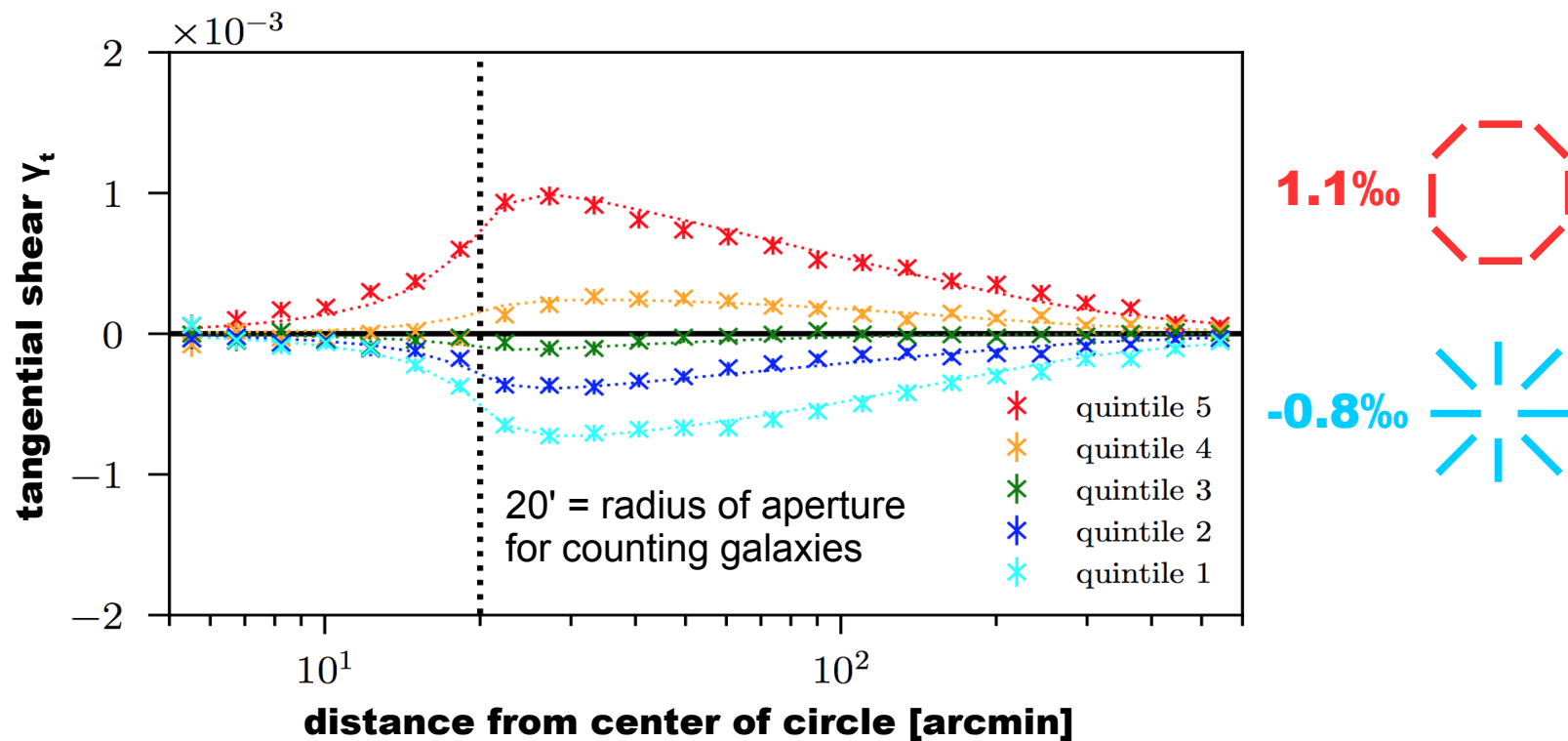
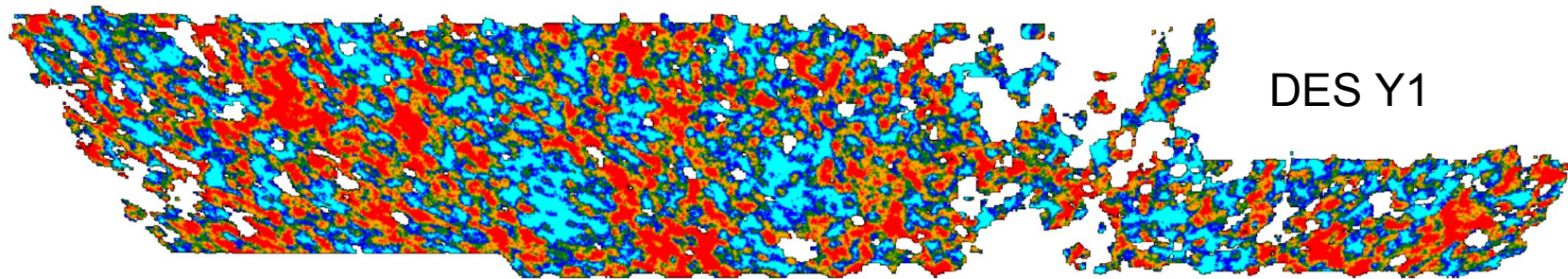
Cosmology from matter/galaxy PDF

Step 2: Divide into count quantiles



Cosmology from matter/galaxy PDF

Step 3: Measure matter density with lensing



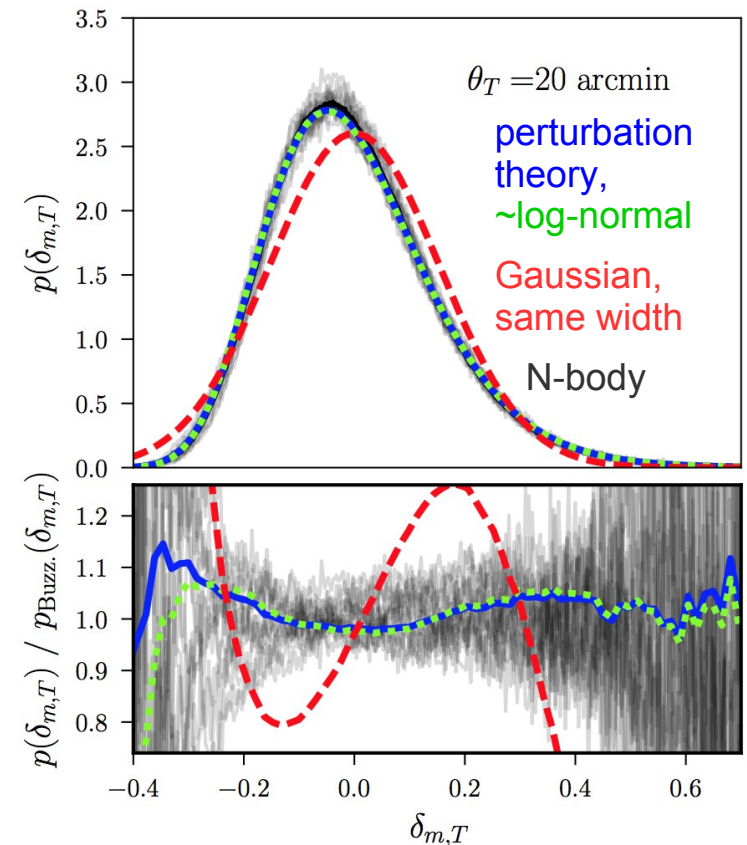
Cosmology from matter/galaxy PDF

Step 4: Model

Ingredients:

- Matter density PDF $p(\delta_m)$ from simulations or perturbation theory
- Galaxy bias $P(N|\delta_m)$
- Matter density \rightarrow lensing shear $\gamma_t(\delta_m)$

$$\langle \gamma_t \rangle(N) = \int p(\delta_m|N) \langle \gamma_t \rangle(\delta_m) d\delta_m$$



perturbation theory model:
Friedrich, DG+ 2018

Cosmology from matter/galaxy PDF: testing skewness

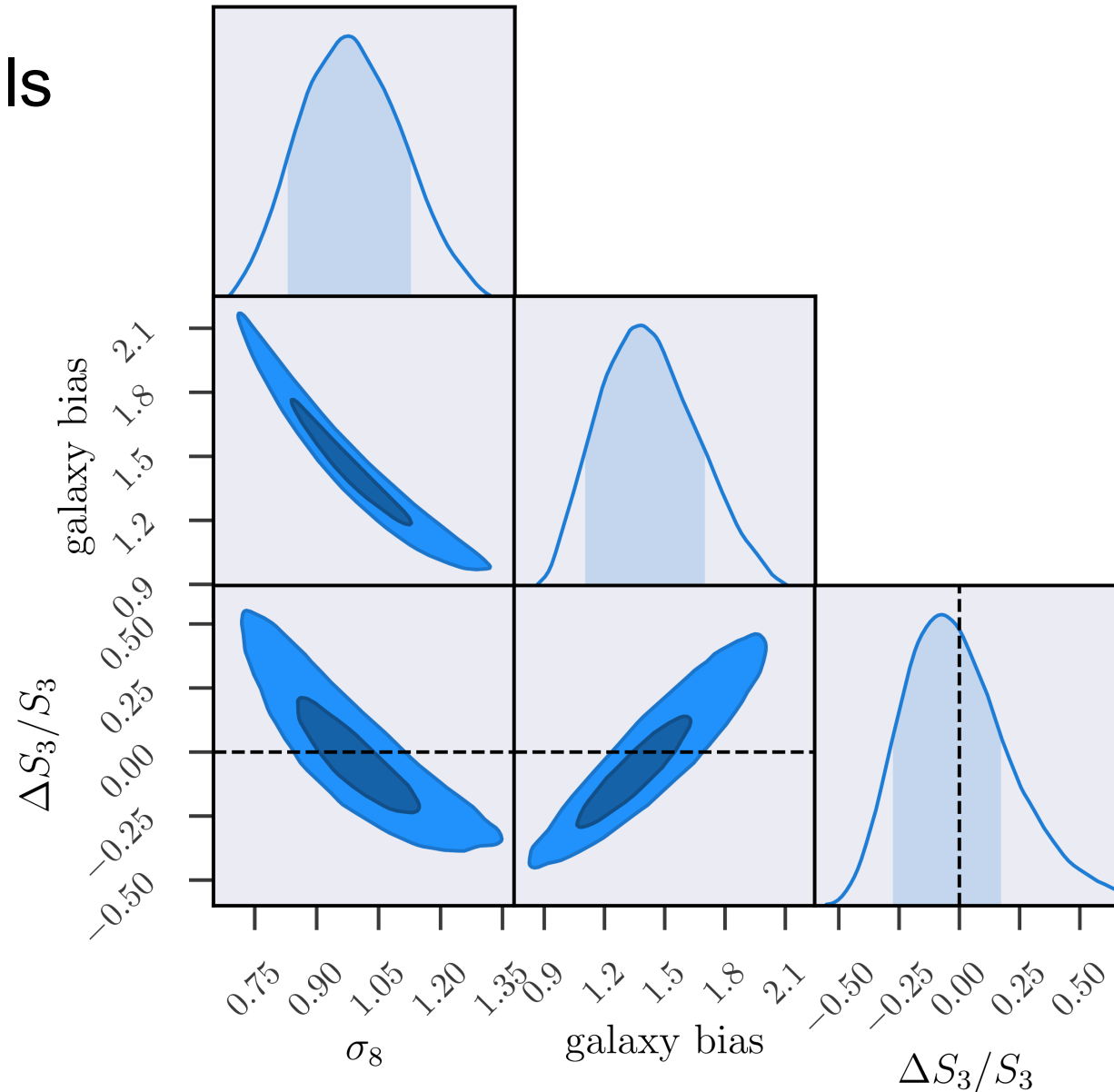
- Lensing + counts in cells
add a test of gravity:
 - Skewness of matter
density:

$$S_3 \equiv \frac{\langle \delta_m^3 \rangle}{\langle \delta_m^2 \rangle^2}$$

Cosmology from matter/galaxy PDF: testing skewness

- Lensing + counts in cells add a test of gravity:
 - Skewness of matter density:

$$S_3 \equiv \frac{\langle \delta_m^3 \rangle}{\langle \delta_m^2 \rangle^2}$$



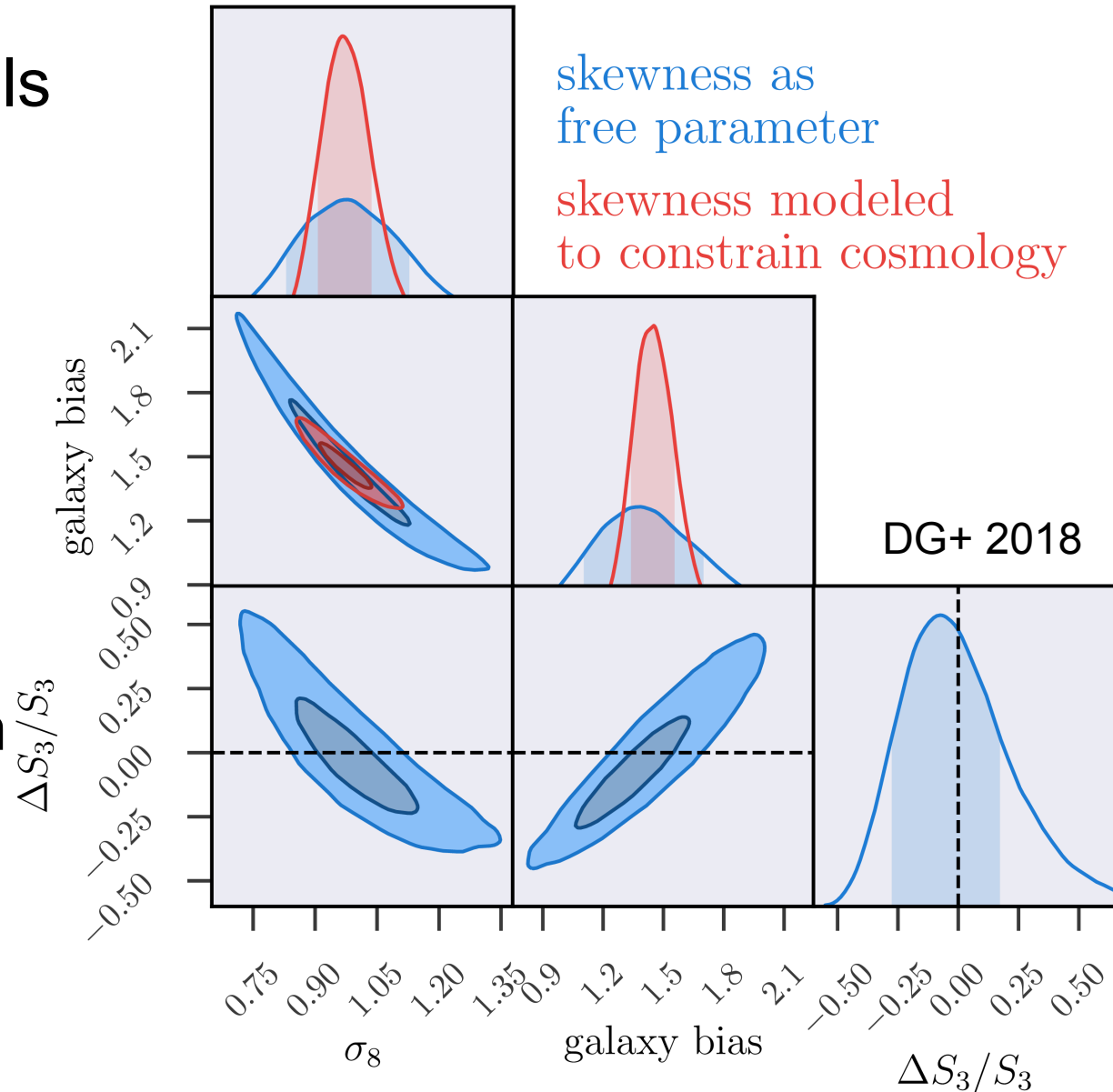
Cosmology from matter/galaxy PDF: skewness informs cosmology

- Lensing + counts in cells add a test of gravity:

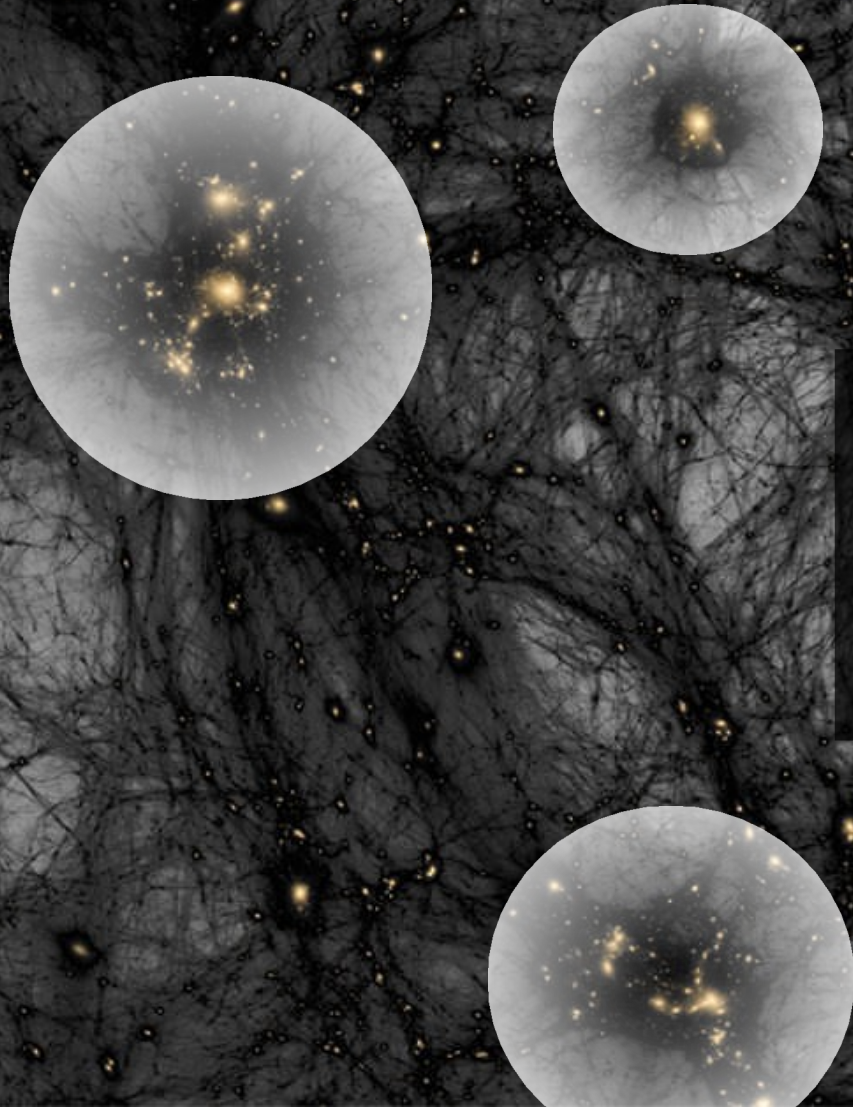
- Skewness of matter density:

$$S_3 \equiv \frac{\langle \delta_m^3 \rangle}{\langle \delta_m^2 \rangle^2}$$

- Non-Gaussianity adds significant information on cosmology and bias



Clusters of galaxies

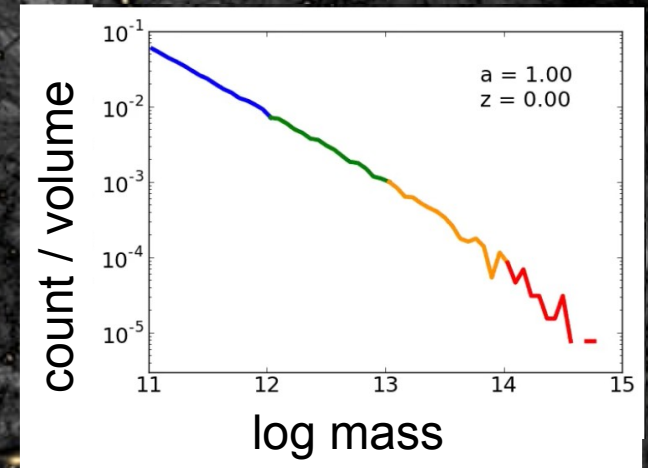
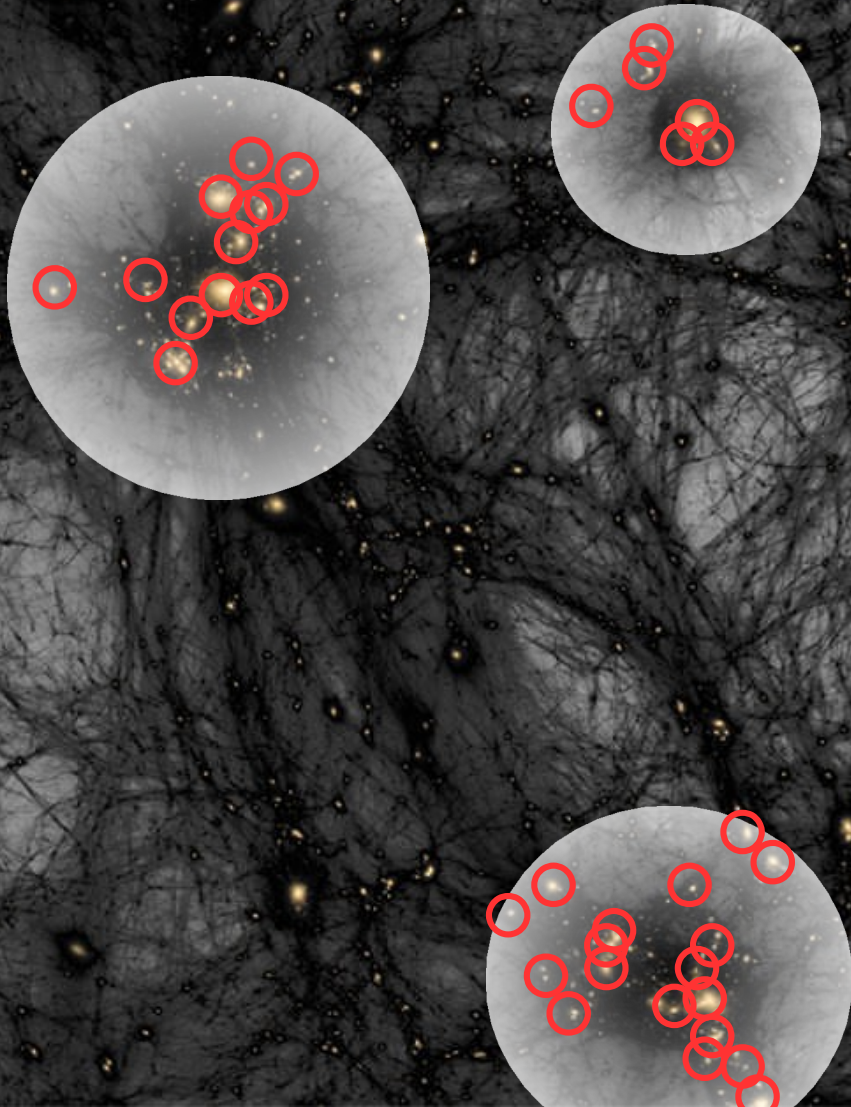


few $\times 10^6$ lightyears, $>10^{14} M_{\text{sol}}$

stars \ll hot gas \ll dark matter

O(10,000) in DES/LSST

Clusters of galaxies in optical surveys



prediction: $n(\text{mass})$

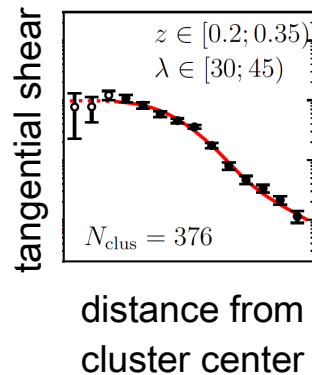
richness =
count of bright
elliptical galaxies

$p(\text{richness}|\text{mass}) = ?$

Cosmology with clusters of galaxies:

Mass calibration with lensing

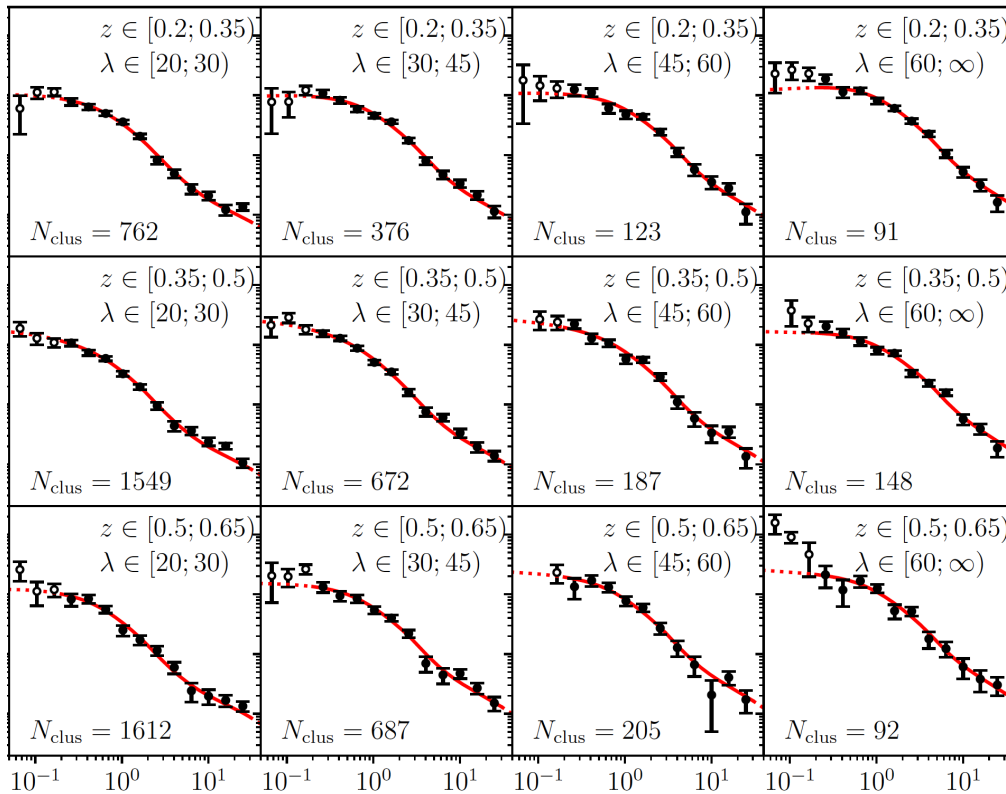
- Large area lensing surveys are the best way of calibrating $\langle \text{mass} | \text{observable} \rangle$ of clusters



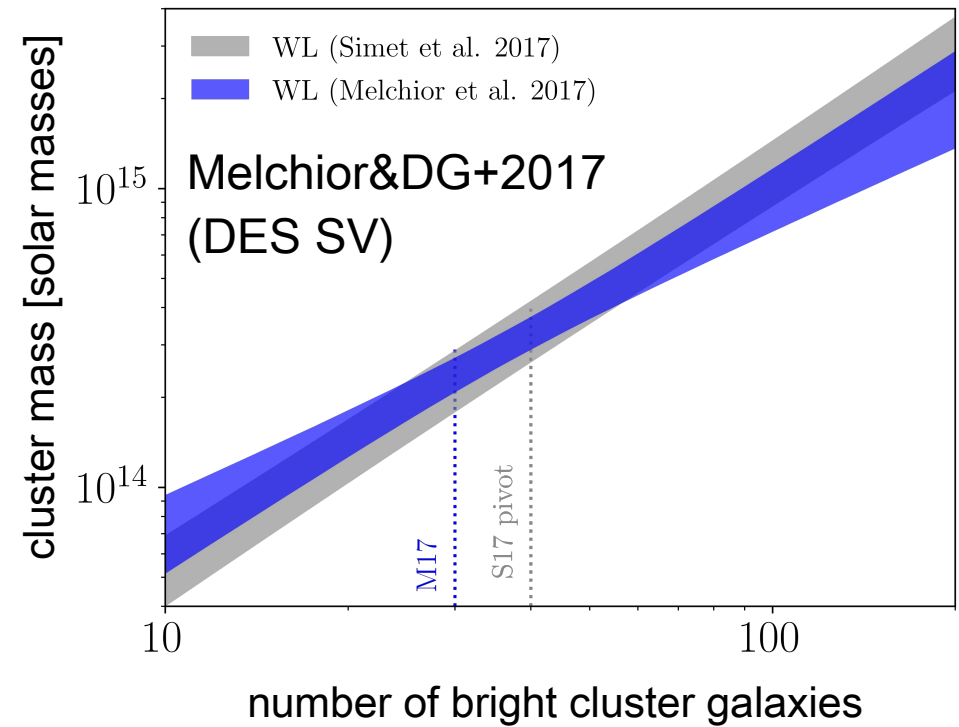
Cosmology with clusters of galaxies: Mass calibration with lensing

- Large area lensing surveys are the best way of calibrating $\langle \text{mass} | \text{observable} \rangle$ of clusters

tangential shear \sim excess surface mass density

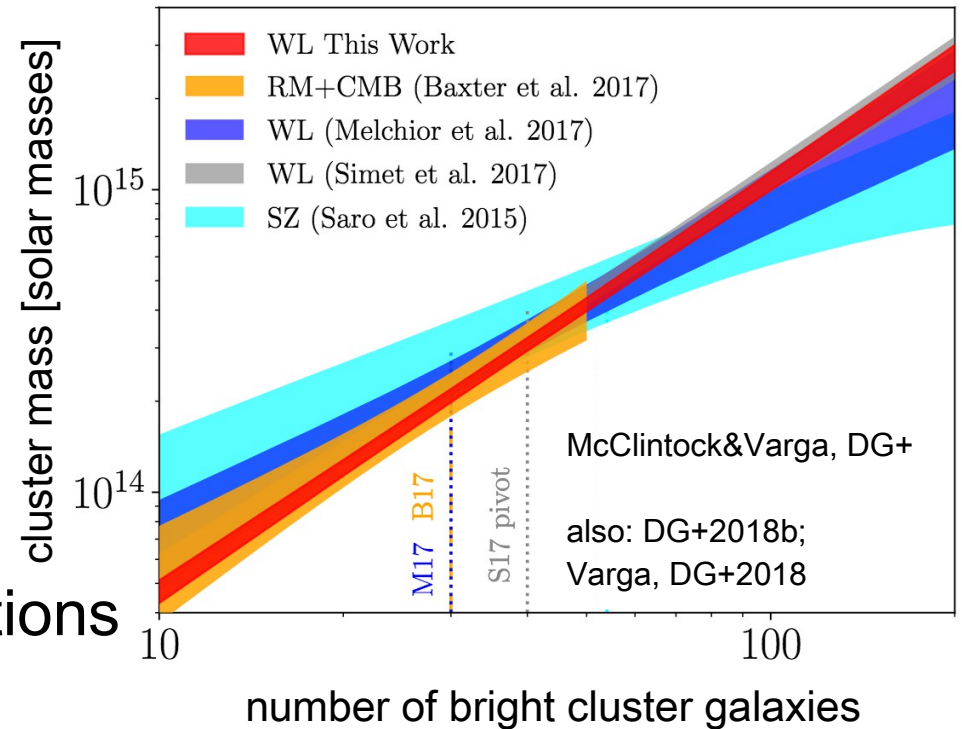


distance from cluster center



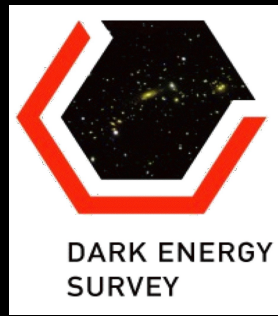
Cosmology with clusters of galaxies: Mass calibration with lensing

- Large area lensing surveys are the best way of calibrating $\langle \text{mass} | \text{observable} \rangle$ of clusters
- Uncertainties dominated by modeling (projections!) and photo-z
- Way forward: external data, simulations constraining power $\sim 3 \times 2 \text{pt}$

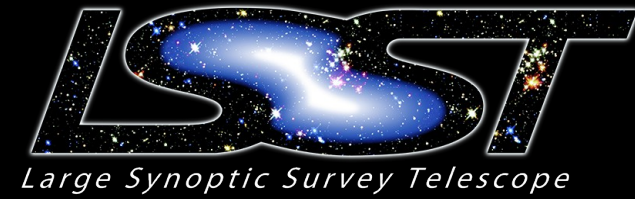


Source of systematic	SV Amplitude uncertainty	Y1 Amplitude Uncertainty	
Shear measurement	4%	1.7%	
Photometric redshifts	3%	2.6%	photo-z
Modeling systematics	2%	0.73%	
Cluster triaxiality	2%	2.0%	Modeling / projections
Line-of-sight projections	2%	2.0%	
Membership dilution + miscentering	$\leq 1\%$	0.78%	
Total Systematics	6.1%	4.3%	
Total Statistical	9.4%	2.4%	
Total	11.2%	5.0%	

From



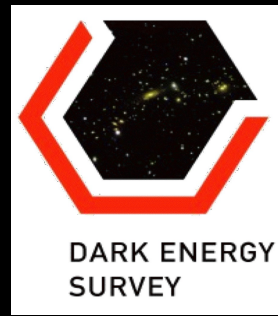
to



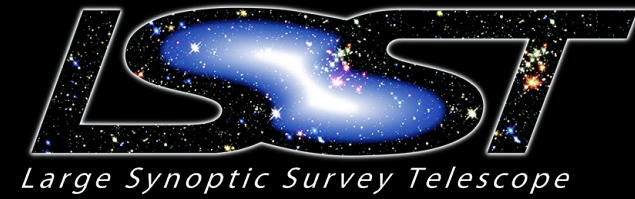
Measurements

- galaxy shapes
- redshift distributions
- faint & blended frontier

From



to



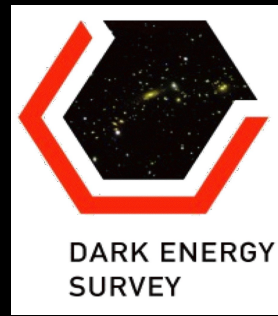
Measurements

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- redshift distributions
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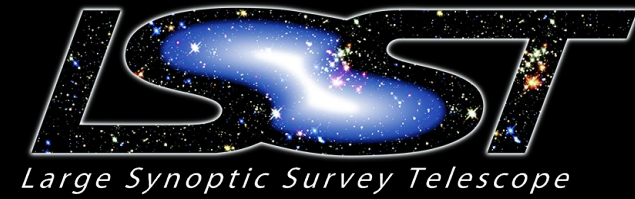
External data

- Spectroscopy / DESI
- Narrow-band surveys
- X-ray, SZ clusters
- CMB-S4

From



to



Measurements

- galaxy shapes
- redshift distributions
- faint & blended frontier

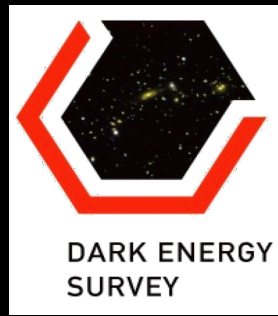
Modeling

- structure on smaller scales
- beyond power spectrum
- simulation as model

External data

- Spectroscopy / DESI
- Narrow-band surveys
- X-ray, SZ clusters
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From



to



Measurements

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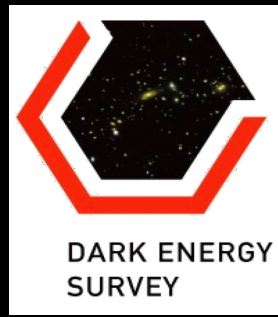
External data

- Spectroscopy / DESI
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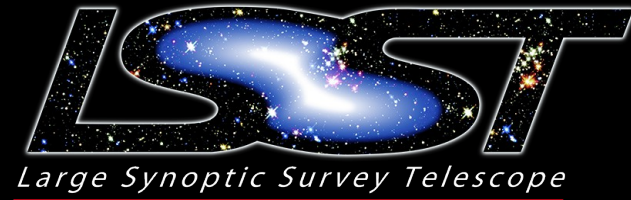
Bayesian analysis

- Covariance
- Bayesian hierarchical: clusters
- Joint probes

From



to



Measurements

Modeling

External data

Bayesian analysis

ML shapes
DG+10

CCD effects
DG+15a

Redshift selection
biases DG+17

Pheno-z method
Buchs, Davis, DG+19

**Pheno-z for
DES**

**LSST Blended
Pheno-z**

SZ cluster WL
DG+13, 14

DES pilot narrow-band and
deep cluster field program

**Cluster follow-up with
X-ray and Spec-z**

**LSST redshift
calibration data**

Cluster covariance
DG+15b

Matter/galaxy PDF
Friedrich, DG+18

**Accurate optical
cluster lensing profiles**

**Galaxy bias for joint
density split statistics**

Cluster Hierarchical
Likelihood DG+15b

Joint 2pt
DES 2018

Density split
likelihood DG+18

**Bayesian Cluster
Framework**

**Cluster / 2pt / DSS
joint analysis**

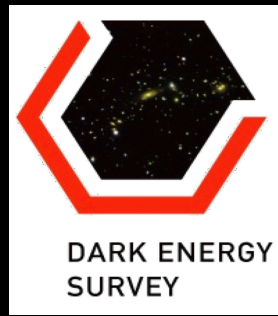
from pixels
to cosmology

past work

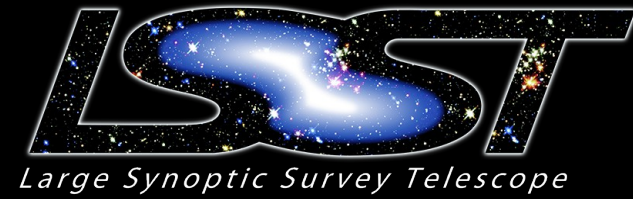
now

LSST turns on

From



to



Measurements

Modeling

External data

Bayesian analysis

DES and LSST
lensing as an
accurate probe
of dark energy
and dark matter

Stress-testing
dark energy and
dark matter
with **non-Gaussian**
structure

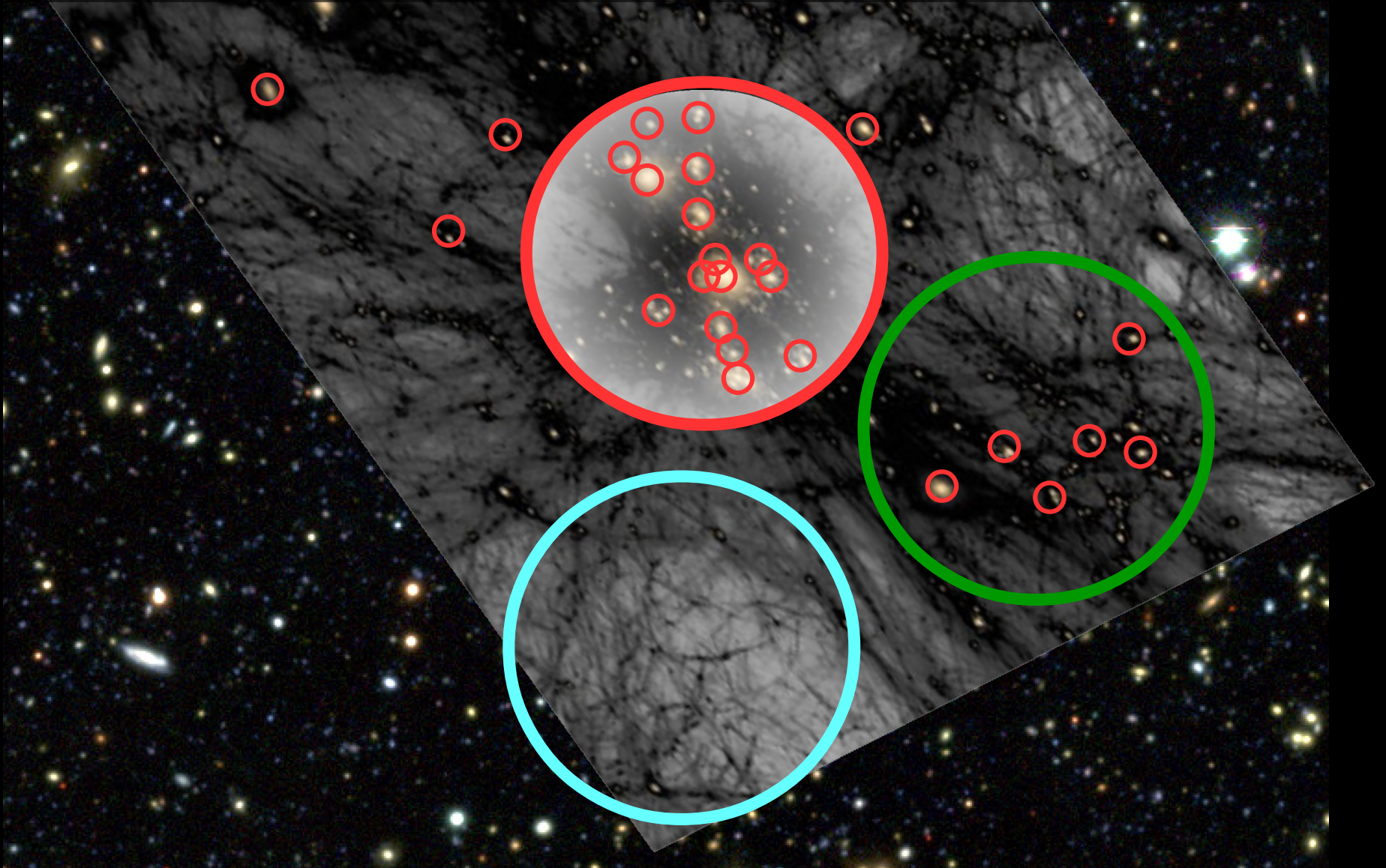
Connecting DES
and LSST to external
data from DESI,
CMB-S4, and
dedicated programs

LSST Dark Energy Science @ SLAC PAC

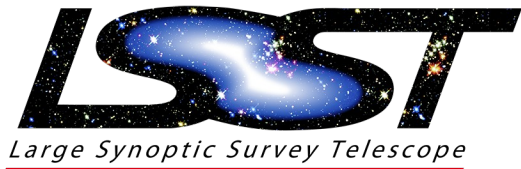


DES observations at ~LSST Y5 depth

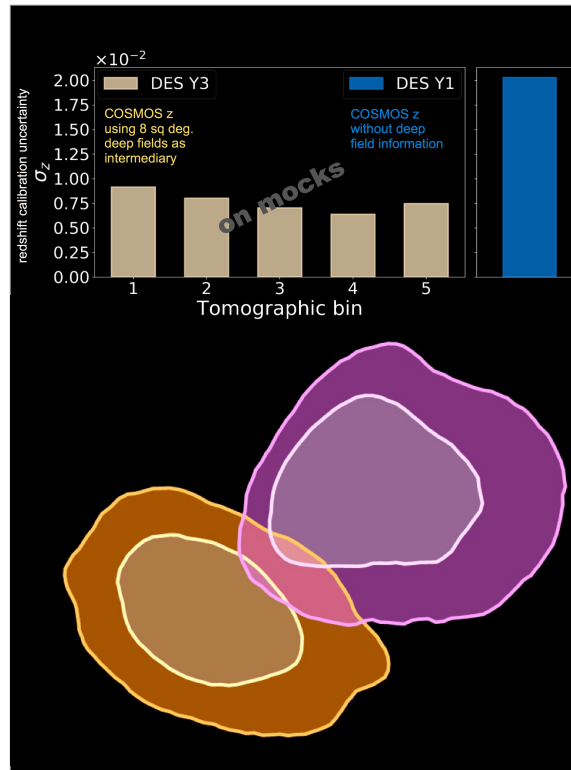
**Accurately connect LSST lensing
and full model of cosmology & structure
to probe dark energy and dark matter**



Unprecedented data from DES &



Precise & accurate lensing analyses



Testing structure beyond the power spectrum

